



Tanjona R. Rabemananjara

In Collab. W/ A. Candido, A. Garcia, G. Magni, J. Rojo, R. Stegeman

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Based on [arXiv:2302.08527](https://arxiv.org/abs/2302.08527) / [10.1007/JHEP05\(2023\)149](https://doi.org/10.1007/JHEP05(2023)149)

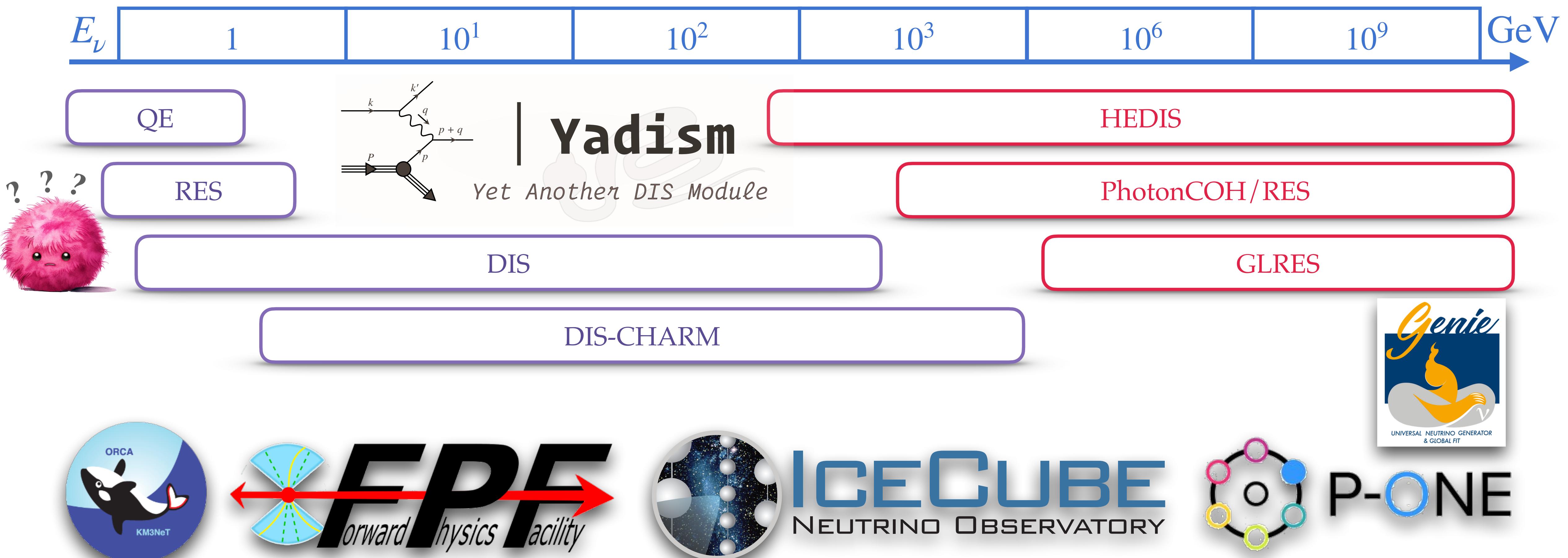


Introduction & Motivations



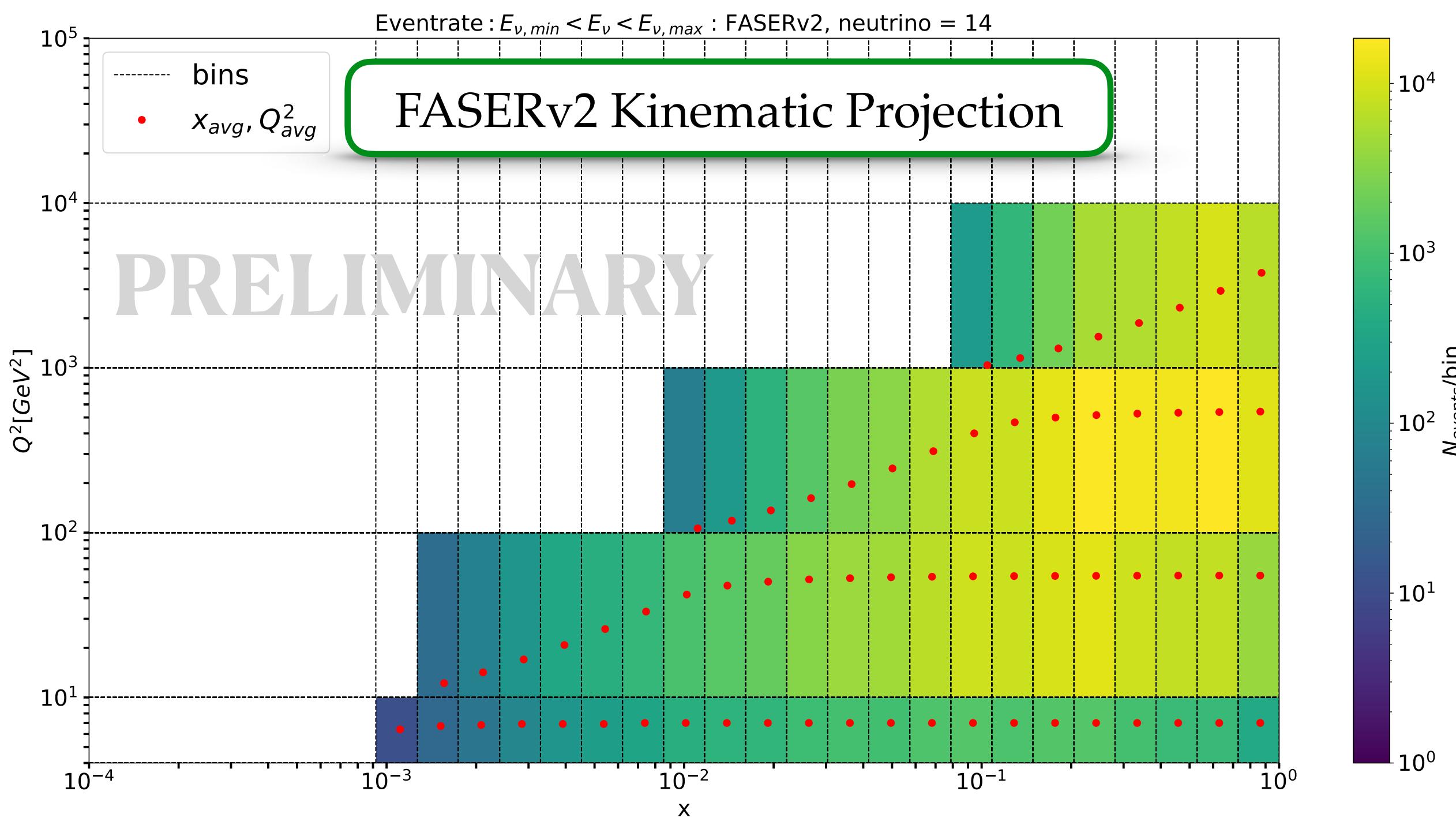
Introduction & Motivations

Interpretation of present and future neutrino experiments requires accurate theoretical predictions for neutrino-nucleon/nucleus scattering rates

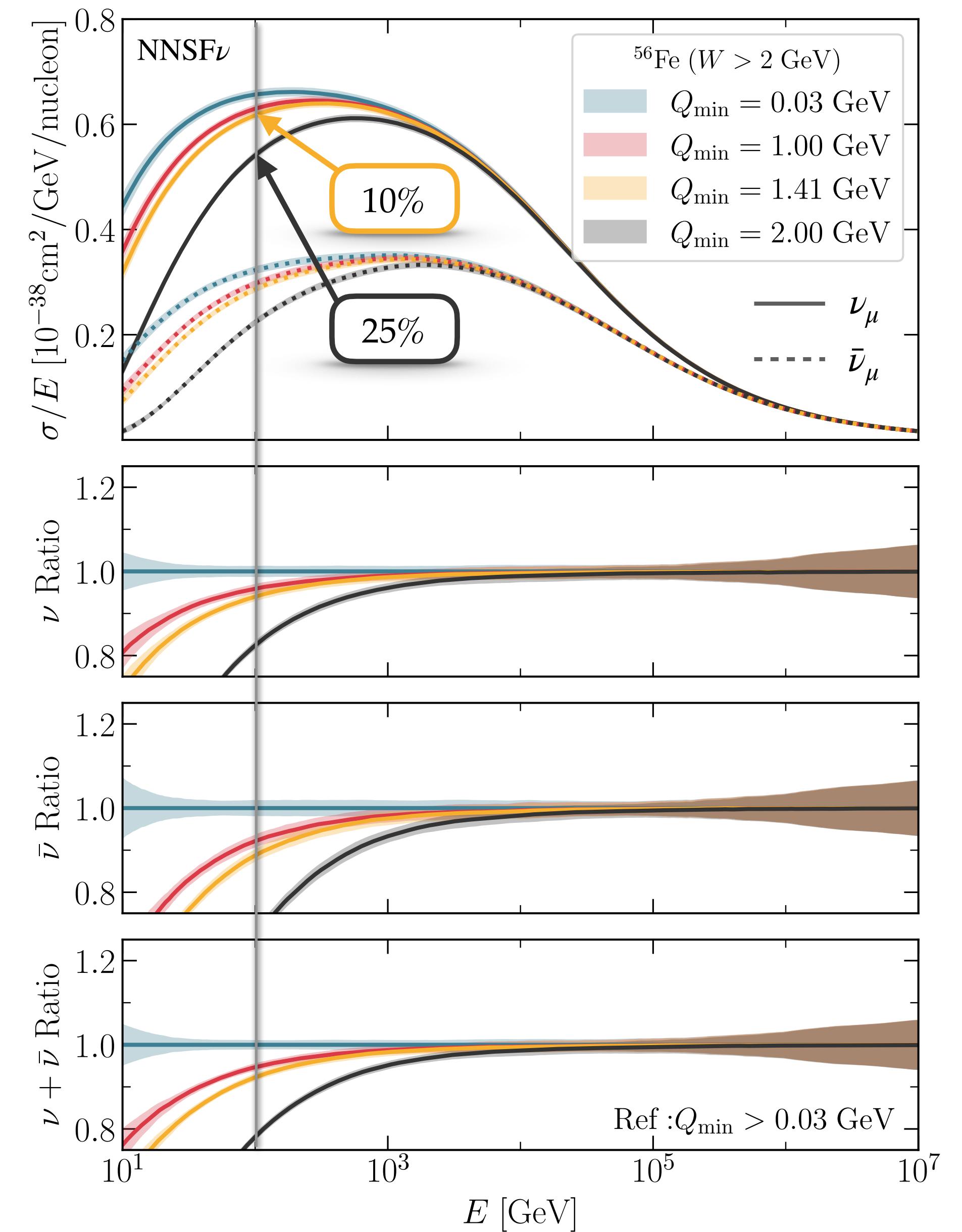


Introduction & Motivations

Inclusive neutrino cross-section receives **sizeable contributions** from $Q < 2 \text{ GeV}$ where QCD calculations cannot be evaluated in the pQCD framework



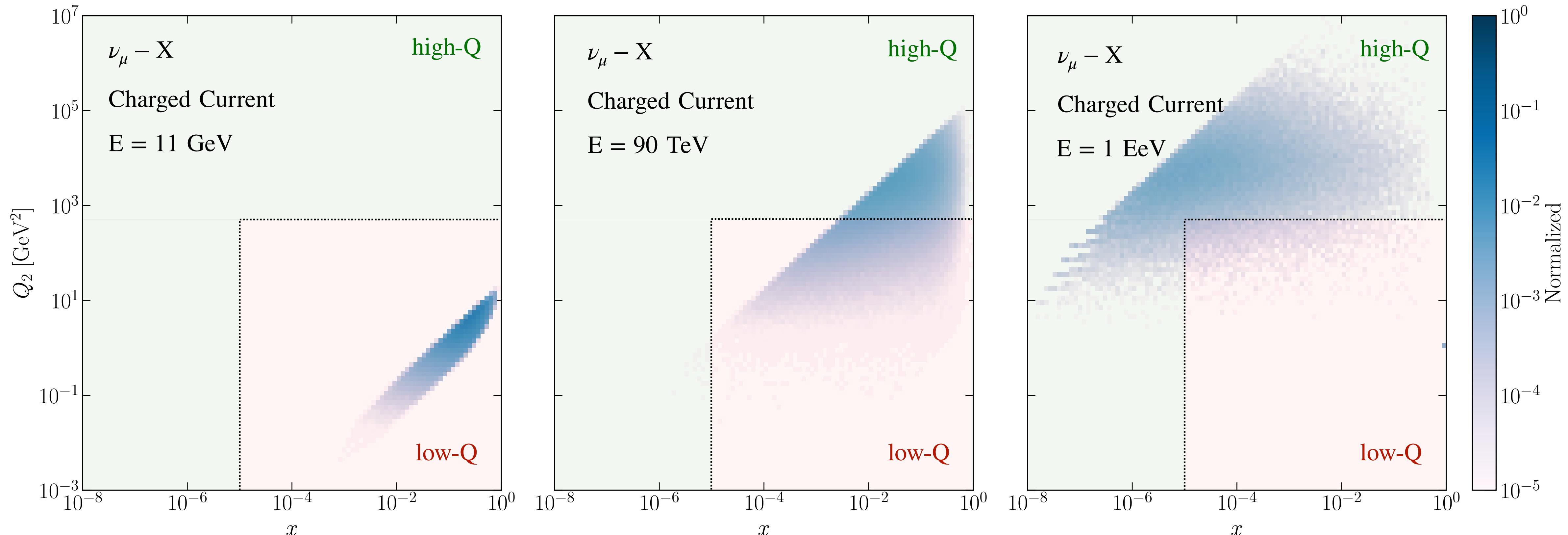
In Collaboration with M. Fieg, T. Giani, P. Krack, T. Rabemananjara, T. Mäkelä, J. C. Martinez, J. Rojo



Relevance of low- Q^2 Regions

In **muon-neutrino inelastic scattering**, at $E_\nu \sim \text{few GeV}$, the total cross-section is determined entirely by the **low- Q^2 regions**:

$$\sigma(E_\nu) = \int_{Q_{\min}^2}^{2m_N E_\nu} dQ^2 \int_{Q^2/(2m_N y E_\nu)}^1 dx \left[\frac{d^2\sigma}{dx dQ^2}(x, Q^2, E_\nu) \equiv \sum_i \mathcal{C}_i F_i(x, Q^2) \right]$$



Model the low- Q^2 : Bodek-Yang (BY)

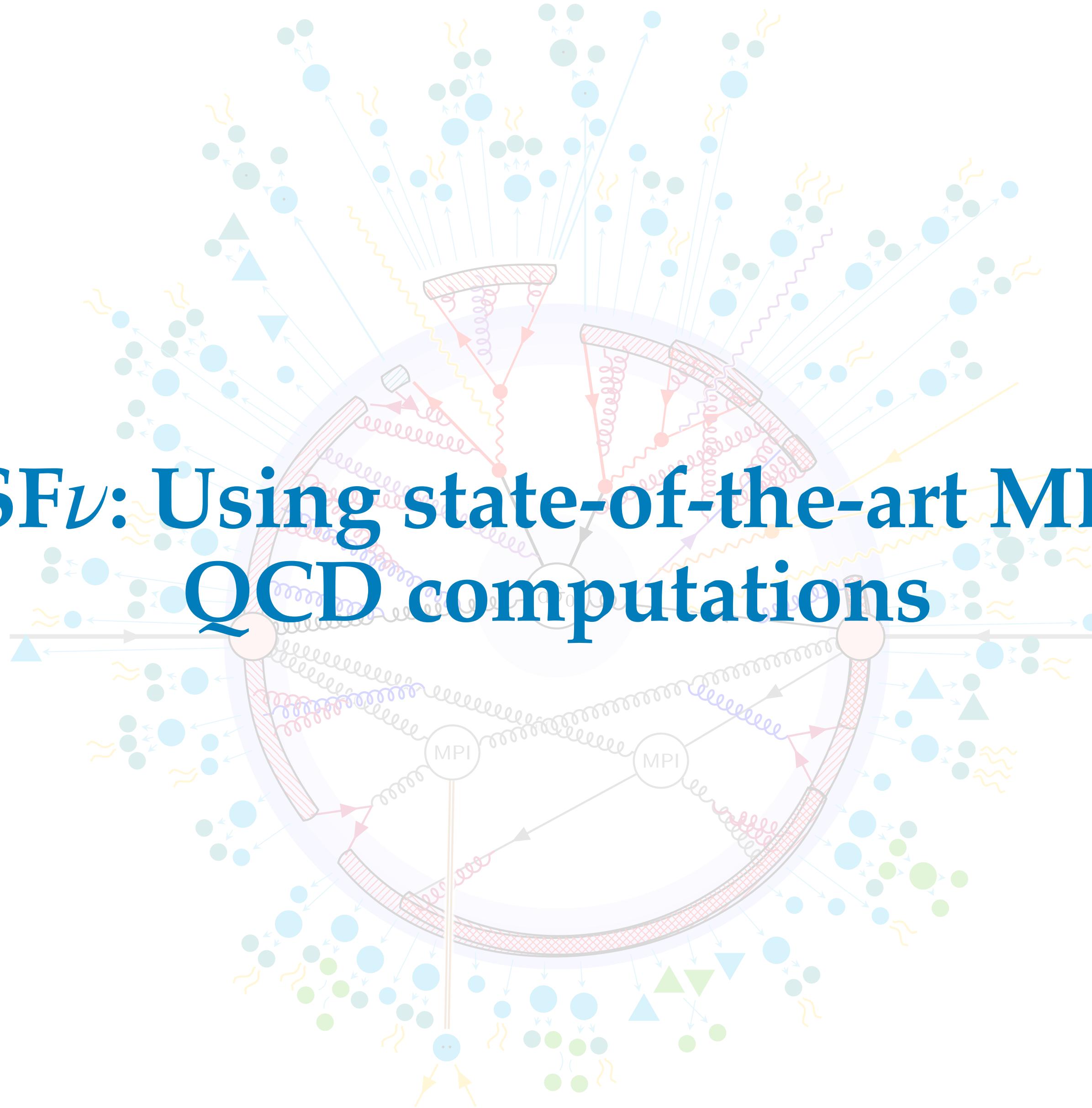
BY is based on **Effective LO Parton Distribution Functions (PDFs)** (GRV98LO) with modified scaling variables and K-factors to approximate higher-order QCD corrections:

$$f_i^{\text{LO}}(x, Q^2) \longrightarrow f_i^{\text{LO}}(\xi, Q^2), \quad \text{with} \quad \xi = \frac{2x(Q^2 + m_f^2 + B)}{2Ax + \left[1 + \sqrt{1 + (2m_N x)^2/Q^2} \right]}$$

Shortcomings of the BY model:

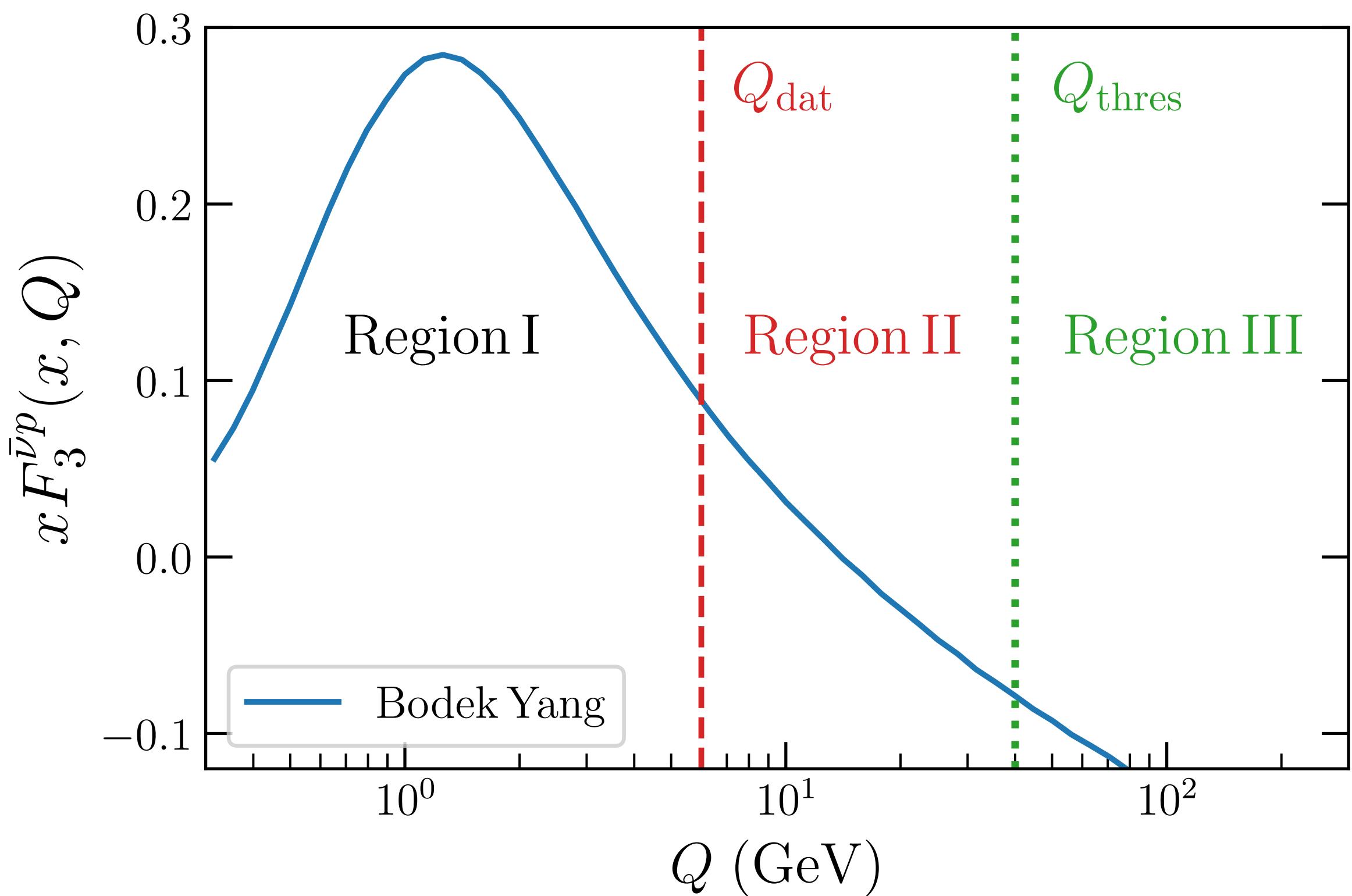
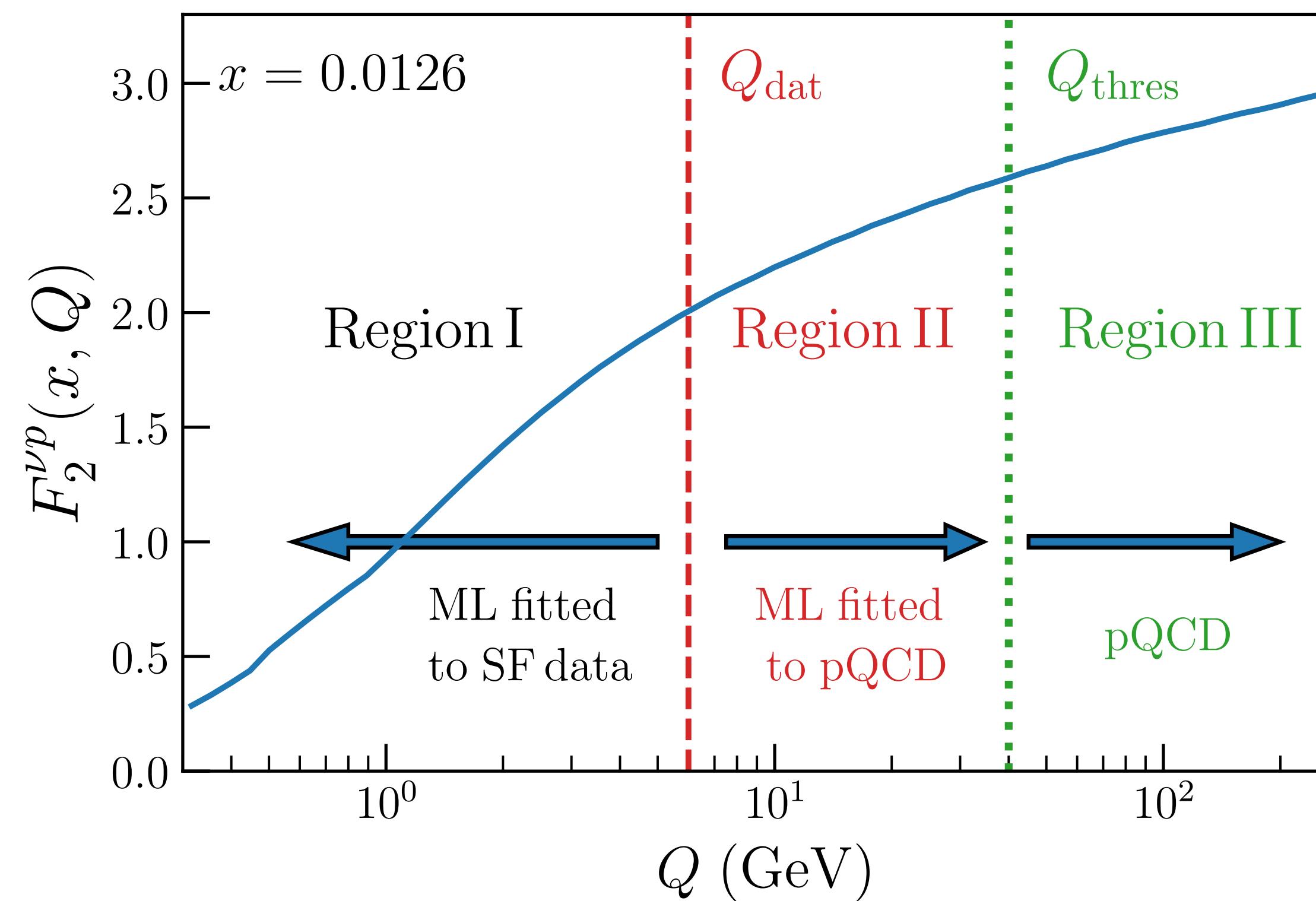
- **Obsolete PDF parametrisation** that neglects constraints on proton & nuclear structure in the last 25 years
- **Neglect higher-order perturbative QCD calculations** (which can be significant)
- **Cannot be matched** to calculations of **high-energy neutrino scattering** based on modern PDF and higher-QCD calculations, introducing an unnecessary **separation between modelling of neutrino interactions** sensitive to **different energy regions**.
- **Lack of systematic estimate of the uncertainties** associated to the predictions $\iff \nexists$ **degree of belief**

NNSF ν : Using state-of-the-art ML and QCD computations

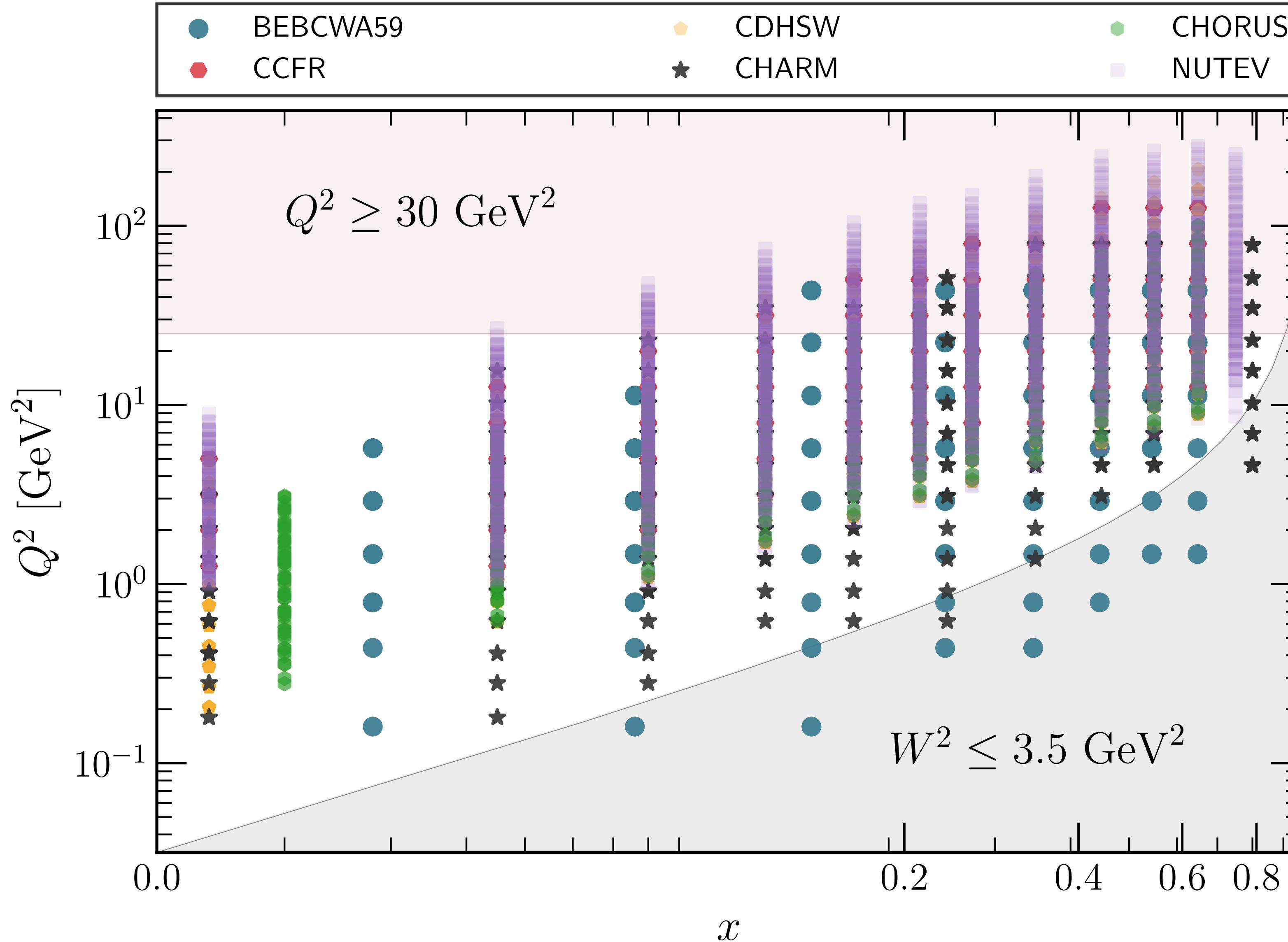


NNSF ν : The Approach

- Use available **data** on neutrino-nucleus scattering to **parametrise and determine the inelastic structure functions** using a NN as an unbiased interpolant
- The parametrisation is done in such a way that it **converges to the pQCD calculations at large enough Q^2**
- In the region where neutrino energy is sensitive to **large- Q^2** , the parametrisation is **replaced by pQCD calculations**

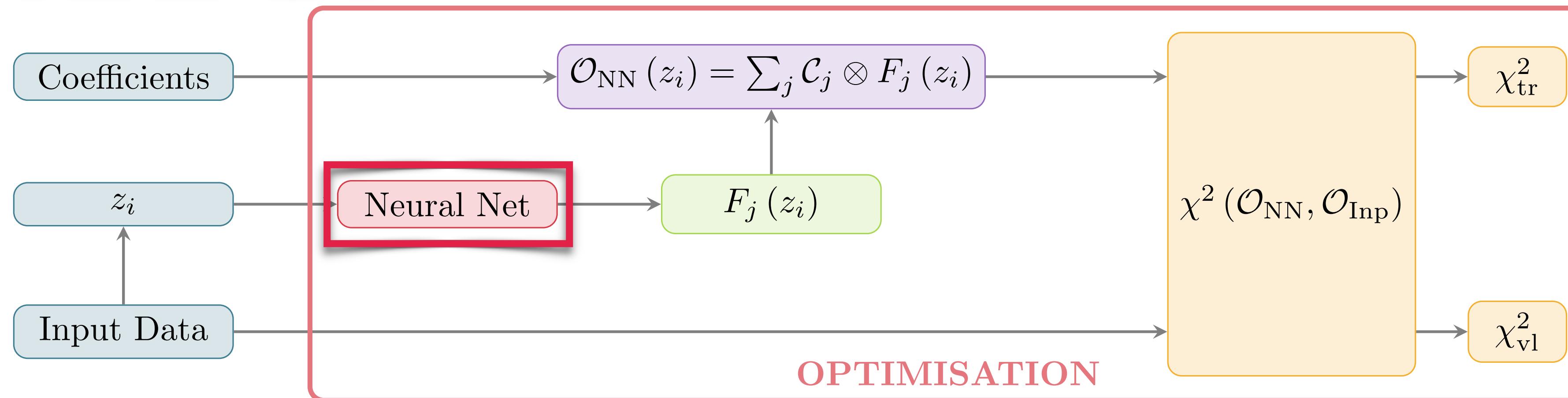


NNSF ν : Experimental Inputs



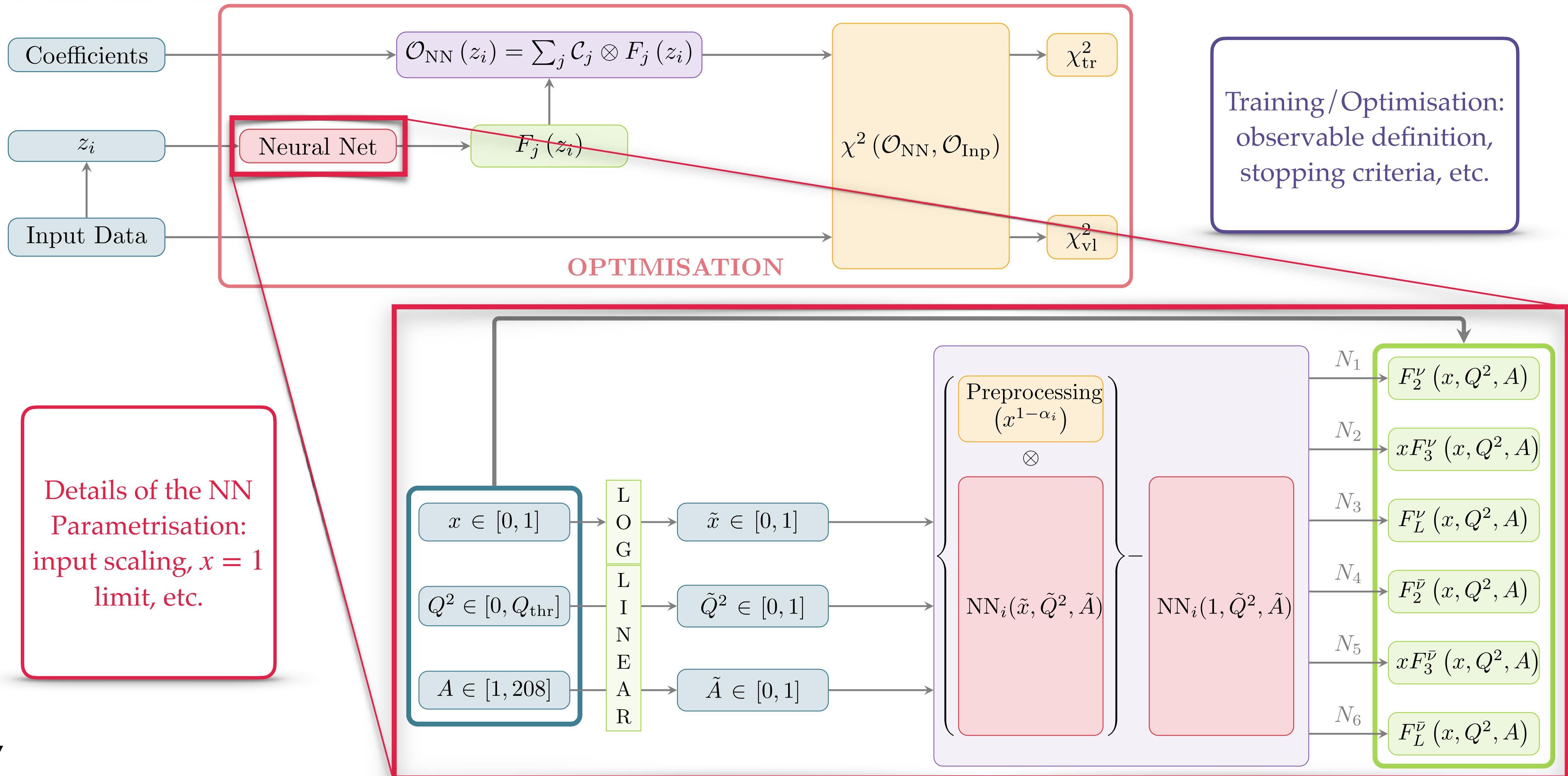
- The datasets include various **observables**, **scattering target**, and **final state** that amounts to **6224 (4184)** before (after) the cut.
- The datasets span a **wide range of kinematics**. Two different types of **cuts** are applied to the experimental datasets: W^2 and Q^2_{\max} .
- The resulting **determination** of neutrino inelastic structure functions are **valid for ~12 orders of magnitude in E_ν** , from ~few GeV to 10^{12} GeV.

NNSF ν : Methodology



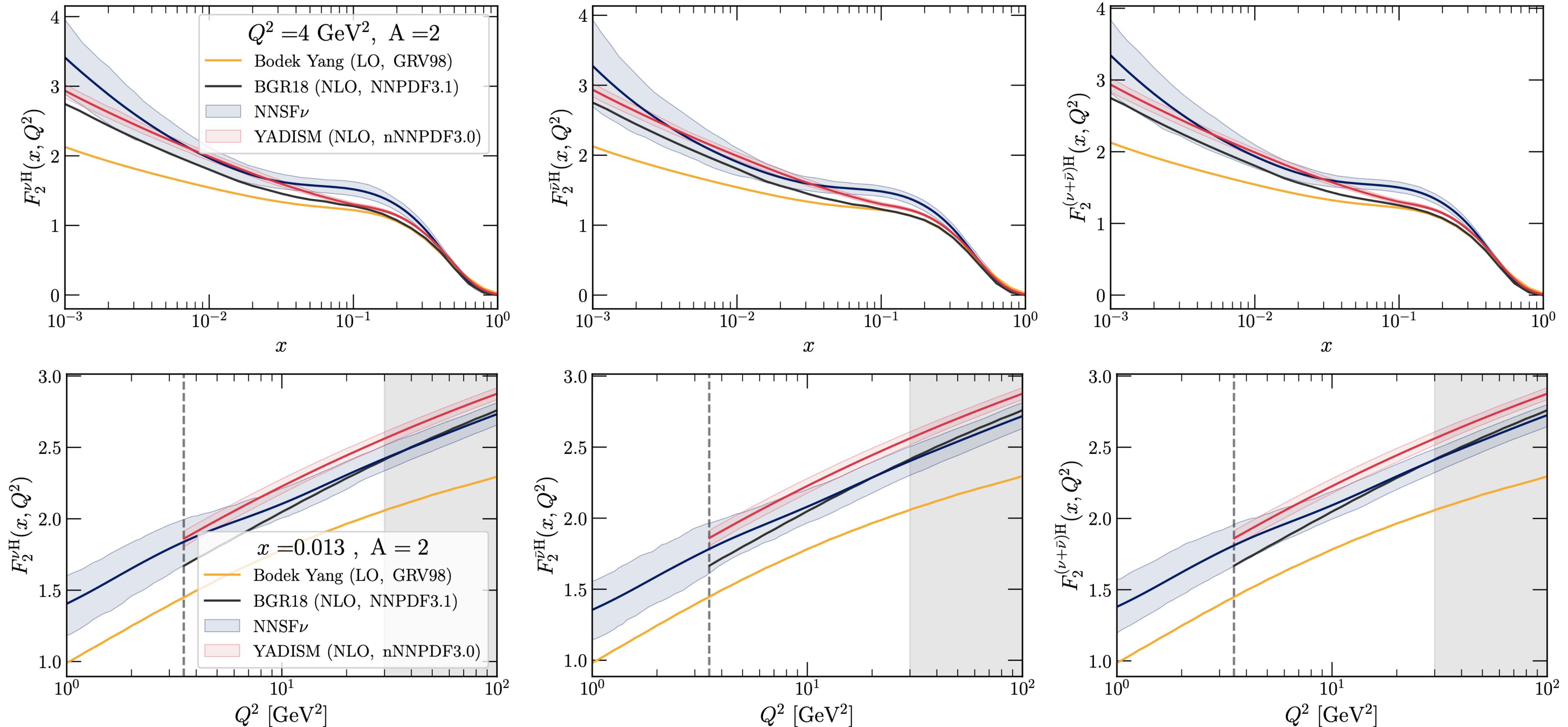
Training / Optimisation:
observable definition,
stopping criteria, etc.

NNSF ν : Methodology



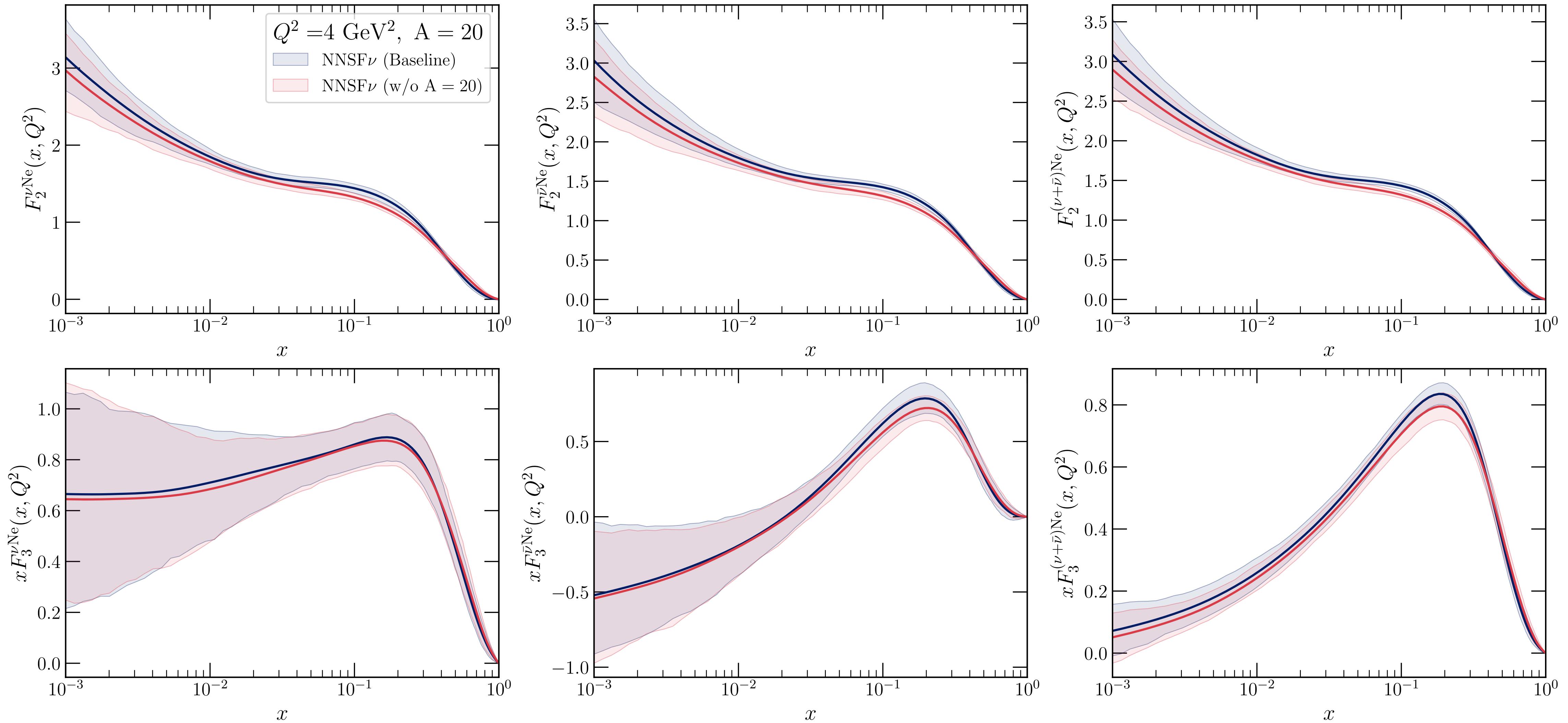
NNSF ν : Neutrino Structure Function Predictions

Smooth transition between data-driven & pQCD computations with proper uncertainty estimate in whole Q range

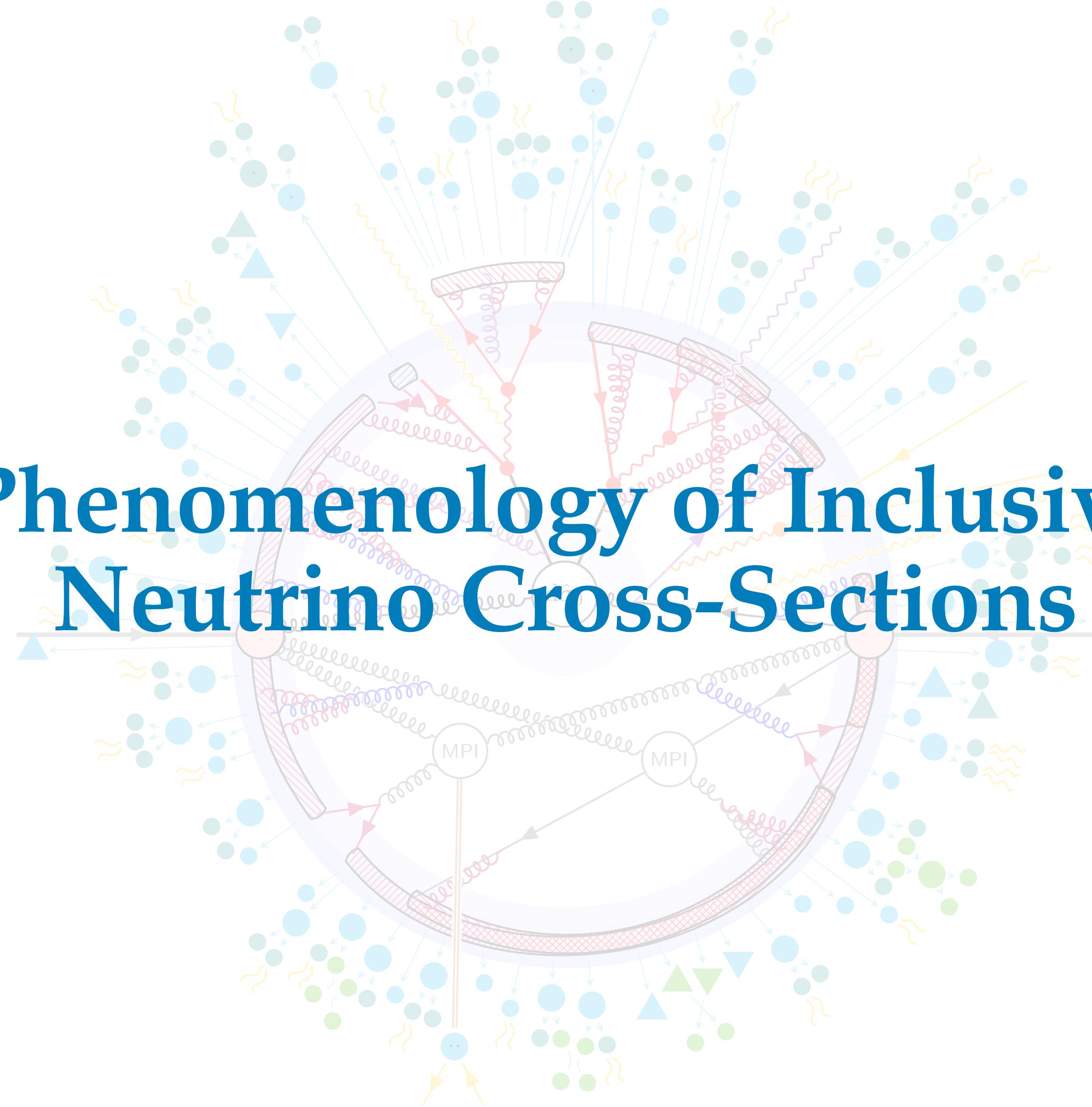


NNSF ν : Interpolation along A

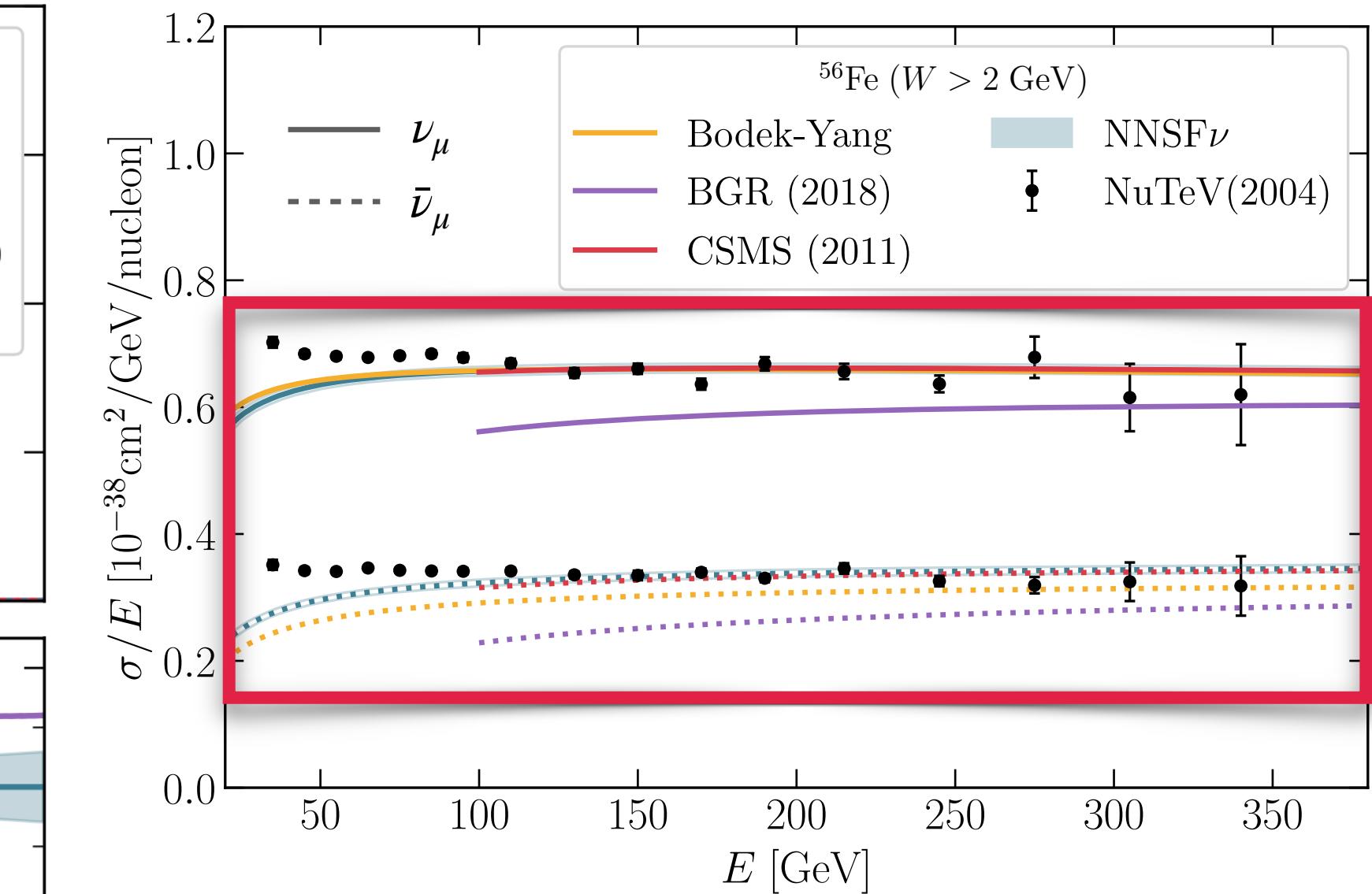
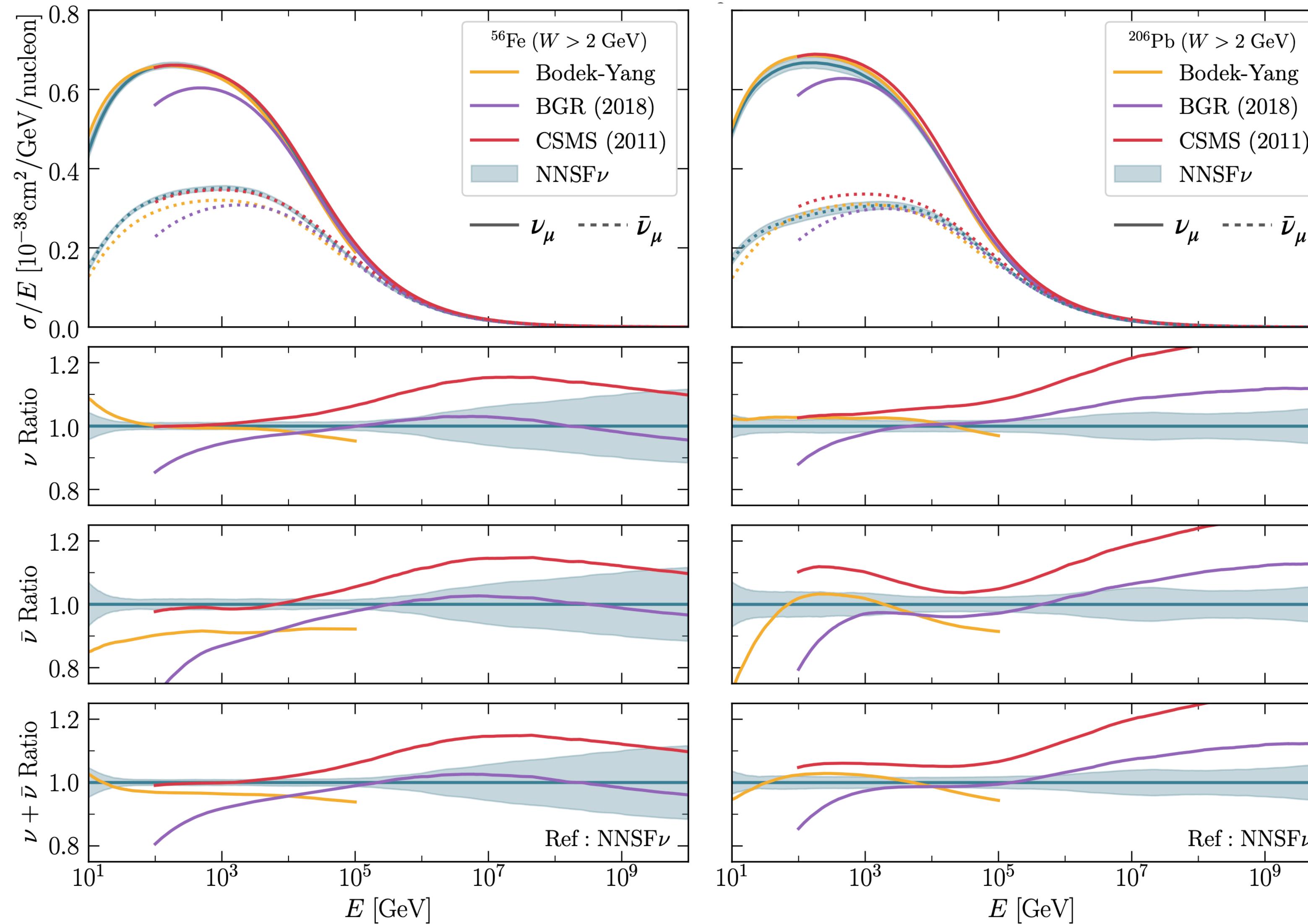
The advantage of parametrising A is that one can generate predictions for nuclei for which direct experimental measurements are not available. To illustrate this we compare two fits in which $A = 20$ is removed in one.



Phenomenology of Inclusive Neutrino Cross-Sections.

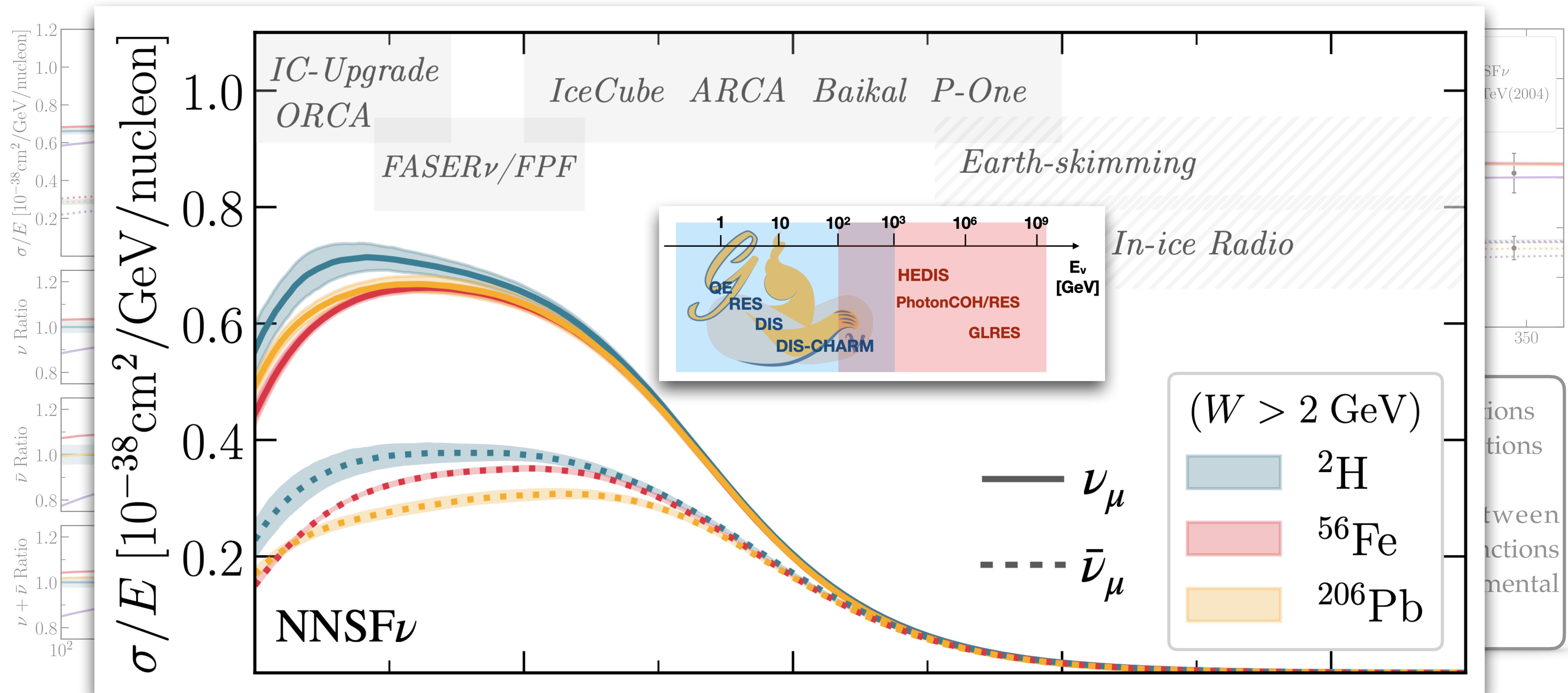


NNSF ν : Inclusive Neutrino-Nucleus Cross-Sections



- NNSF ν : only predictions **valid for all E_ν** with **uncertainty estimate**
- Reliable state-of-the-art predictions for neutrino inclusive cross-sections at **FPF energies**
- Very Good **agreement** between neutrino inelastic structure functions and cross-sections and **experimental measurements**

NNSF ν : Inclusive Neutrino-Nucleus Cross-Sections



Delivery & Usage



Adopting FOSS Philosophy

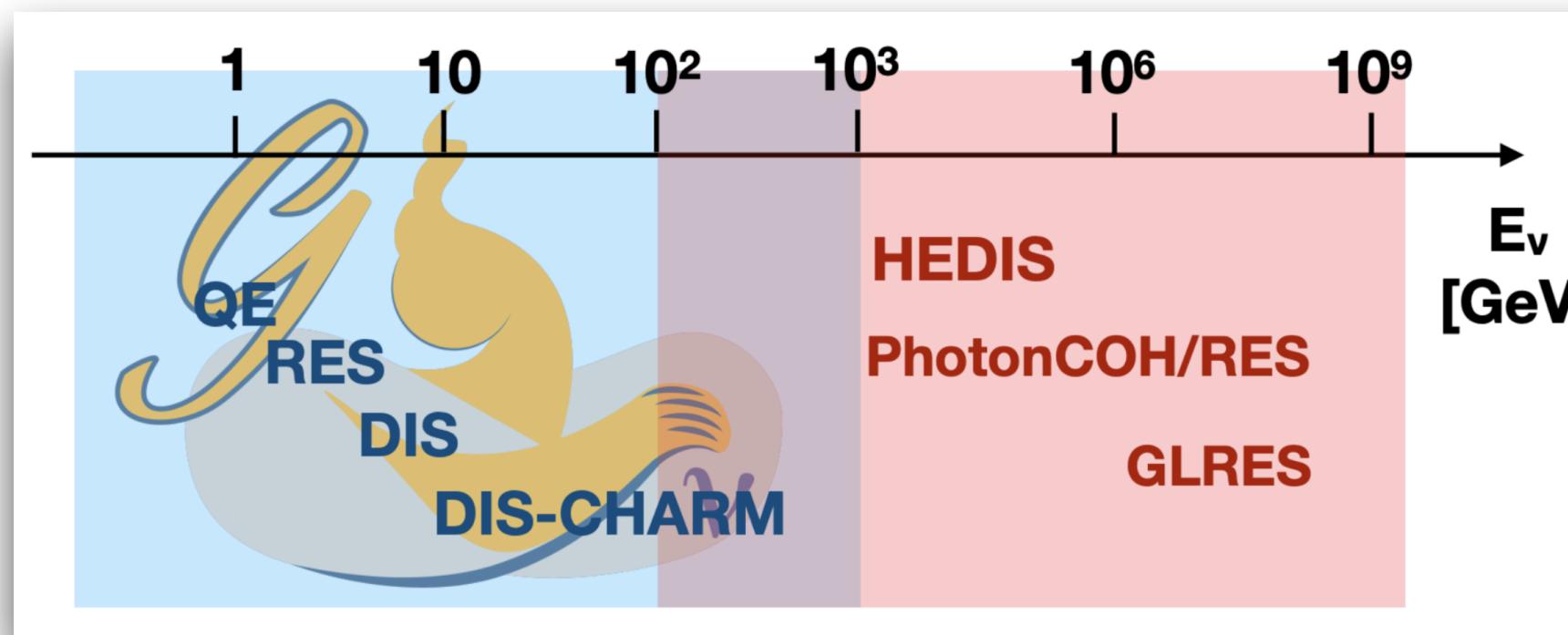
The screenshot shows the GitHub repository landing page for NNSFv. The header includes the repository name "NNSFv", a search bar, and links for "QUICK START", "Description", "Installation", and "TUTORIALS". The main content area features a "Welcome to NNSFv" section with a brief description of the package's purpose: "NNSFv provides predictions for neutrino inelastic structure functions valid for the complete range of energies relevant for phenomenology involving $\nu/\bar{\nu}$ -experiments, from oscillation measurements carried out with reactors, accelerators, and atmospheric neutrinos to astroparticle physics at ultra-high-energy (UHE) neutrino telescopes such as IceCube and KM3NET." Below this are two boxes: "Getting Started" (description of the package and instructions for the installation) and "Tutorials" (various tutorials on using the codes and generating predictions). Buttons for "To quick start" and "To tutorials" are present.

NNSF ν is interfaced with the GENIE MC Generator:

<http://genie-mc.org/>

NNSF ν grids are tabulated in the LHAPDF format:

<https://lhapdf.hepforge.org/index.html>



The code is publicly available at the following link:

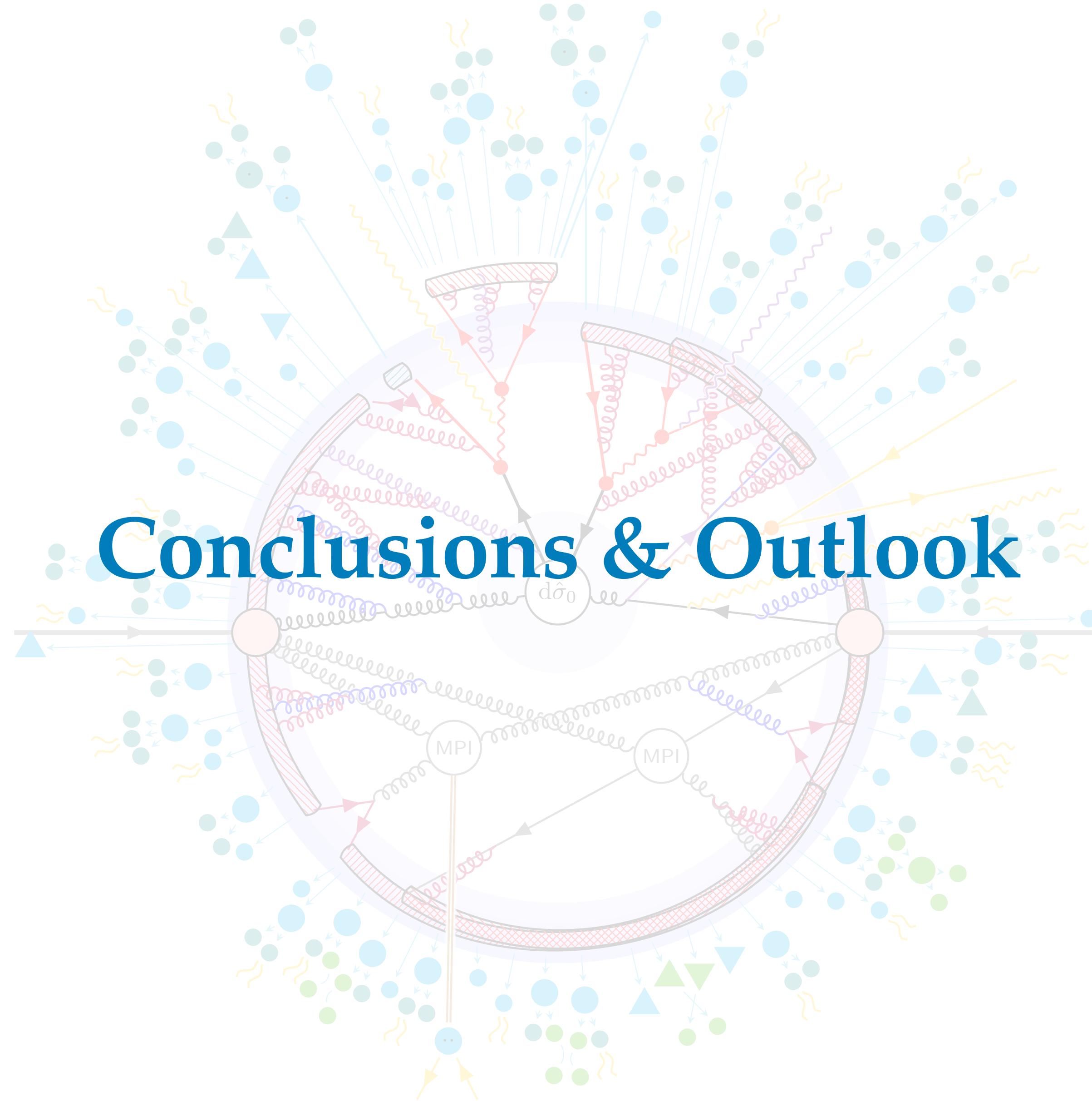
<https://github.com/NNPDF/nnusf>

Documentation along with tutorials are available at:

<https://nnpdf.github.io/nnusf/>

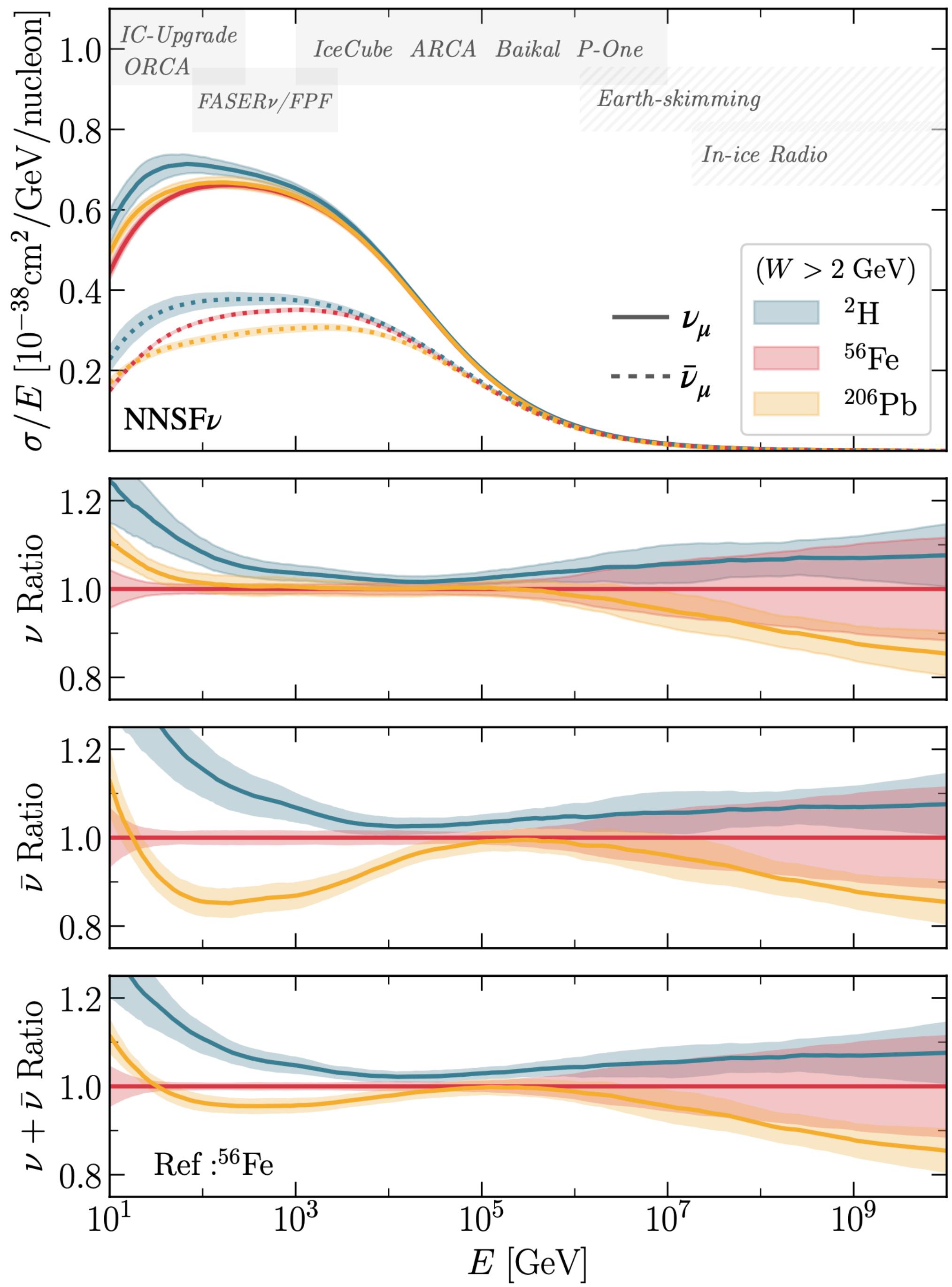
(Z, A) [target]	Low- Q Grid	High- Q Grid
(1, 2)	NNSFnu_D_lowQ	NNSFnu_D_highQ
(2, 4)	NNSFnu_He_lowQ	NNSFnu_He_highQ
(3, 6)	NNSFnu_Li_lowQ	NNSFnu_Li_highQ
(4, 9)	NNSFnu_Be_lowQ	NNSFnu_Be_highQ
(6, 12)	NNSFnu_C_lowQ	NNSFnu_C_highQ
(7, 14)	NNSFnu_N_lowQ	NNSFnu_N_highQ
(8, 16)	NNSFnu_O_lowQ	NNSFnu_O_highQ
(13, 27)	NNSFnu_Al_lowQ	NNSFnu_Al_highQ
(15, 31)	NNSFnu_Ea_lowQ	NNSFnu_Ea_highQ
(20, 40)	NNSFnu_Ca_lowQ	NNSFnu_Ca_highQ
(26, 56)	NNSFnu_Fe_lowQ	NNSFnu_Fe_highQ
(29, 64)	NNSFnu_Cu_lowQ	NNSFnu_Cu_highQ
(47, 108)	NNSFnu_Ag_lowQ	NNSFnu_Ag_highQ
(50, 119)	NNSFnu_Sn_lowQ	NNSFnu_Sn_highQ
(54, 131)	NNSFnu_Xe_lowQ	NNSFnu_Xe_highQ
(74, 184)	NNSFnu_W_lowQ	NNSFnu_W_highQ
(79, 197)	NNSFnu_Au_lowQ	NNSFnu_Au_highQ
(82, 208)	NNSFnu_Pb_lowQ	NNSFnu_Pb_highQ

Conclusions & Outlook

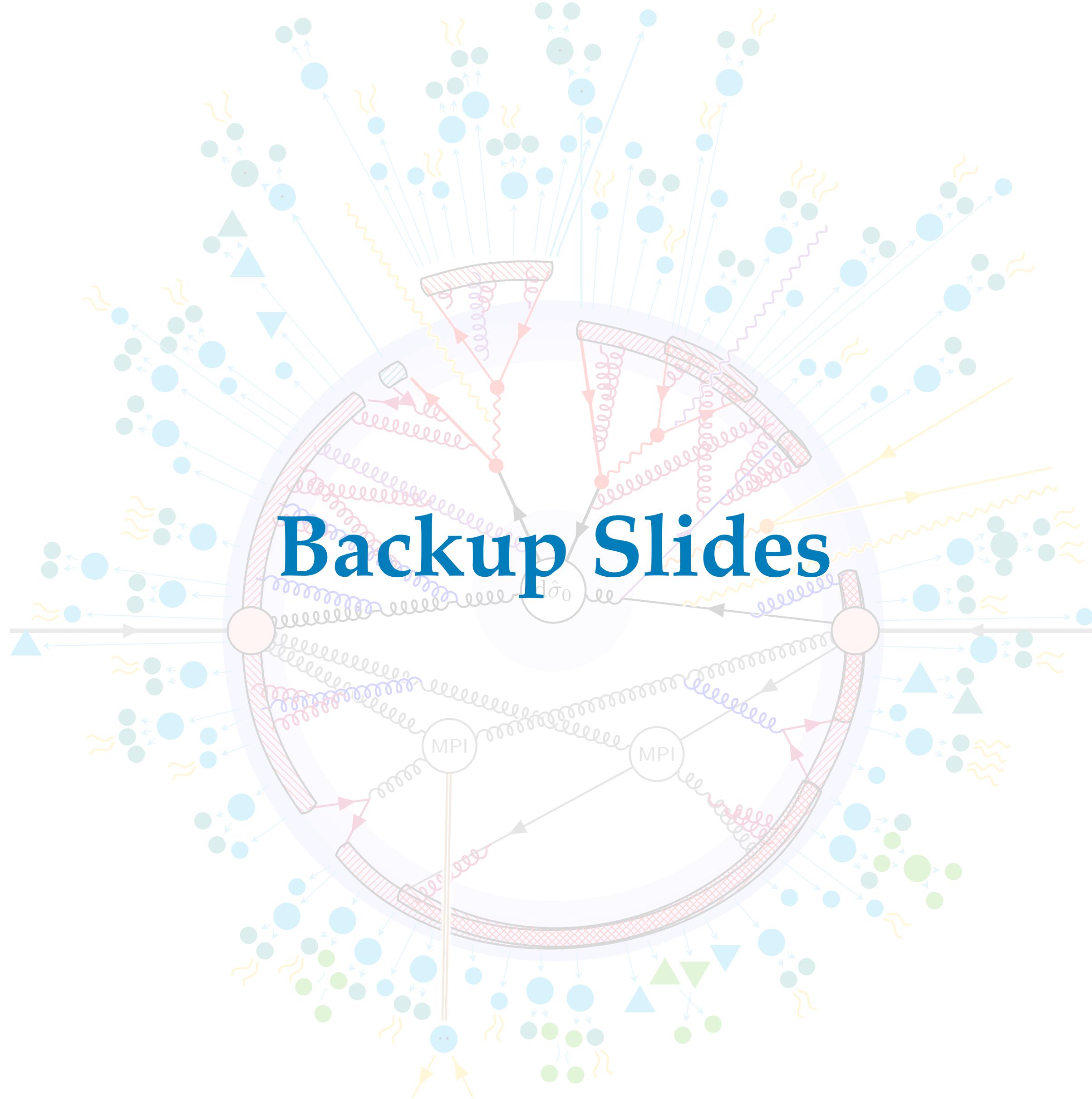


Summary

- Accurate predictions for scattering rate of neutrino-nucleus interactions play a crucial role in interpretation of present neutrino experiments
- The **low- Q^2 regions contribute to a significant degree to the inclusive neutrino inelastic cross-sections**
- State-of-the-art methods relying on Machine Learning provide an unbiased and better predictions for low-energy neutrino physics
- NNSF ν predictions for inelastic neutrino structure functions and cross-sections are valid for all energies relevant for neutrino phenomenology and are **available as interpolation grids in the LHAPDF format & as an interface with GENIE**
- Precision QCD and neutrino physics at future experiments will benefit from precision neutrino structure functions



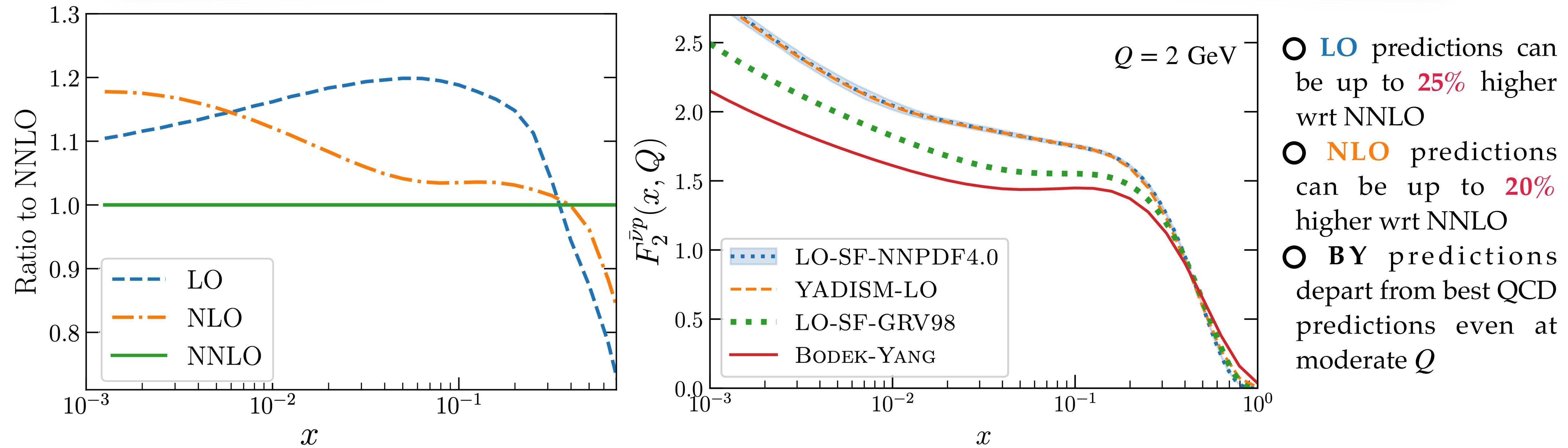
Backup Slides



Model the low- Q^2 : Bodek-Yang

Bodek-Yang (BY) is based on Effective **LO PDFs** (GRV98LO) with **modified scaling variables** and **K-factors** to approximate higher-order QCD corrections:

$$f_i^{\text{LO}}(x, Q^2) \rightarrow f_i^{\text{LO}}(\xi, Q^2), \quad \text{with} \quad \xi = \frac{2x(Q^2 + m_f^2 + B)}{2Ax + \left[1 + \sqrt{1 + (2m_N x)^2/Q^2} \right]}$$



Status of the Yadism Code

NLO	light	heavy	intrinsic	asymptotic
NC	✓	✓	✓	✓
CC	✓	✓	✓	✓
NNLO				
NC	✓	✓	✗	✓
CC	✓	tabulated*	✗	✓
N3LO				
NC	✓	✗ [†]	✗	✗ [‡]
CC	✓	✗ [†]	✗	✗

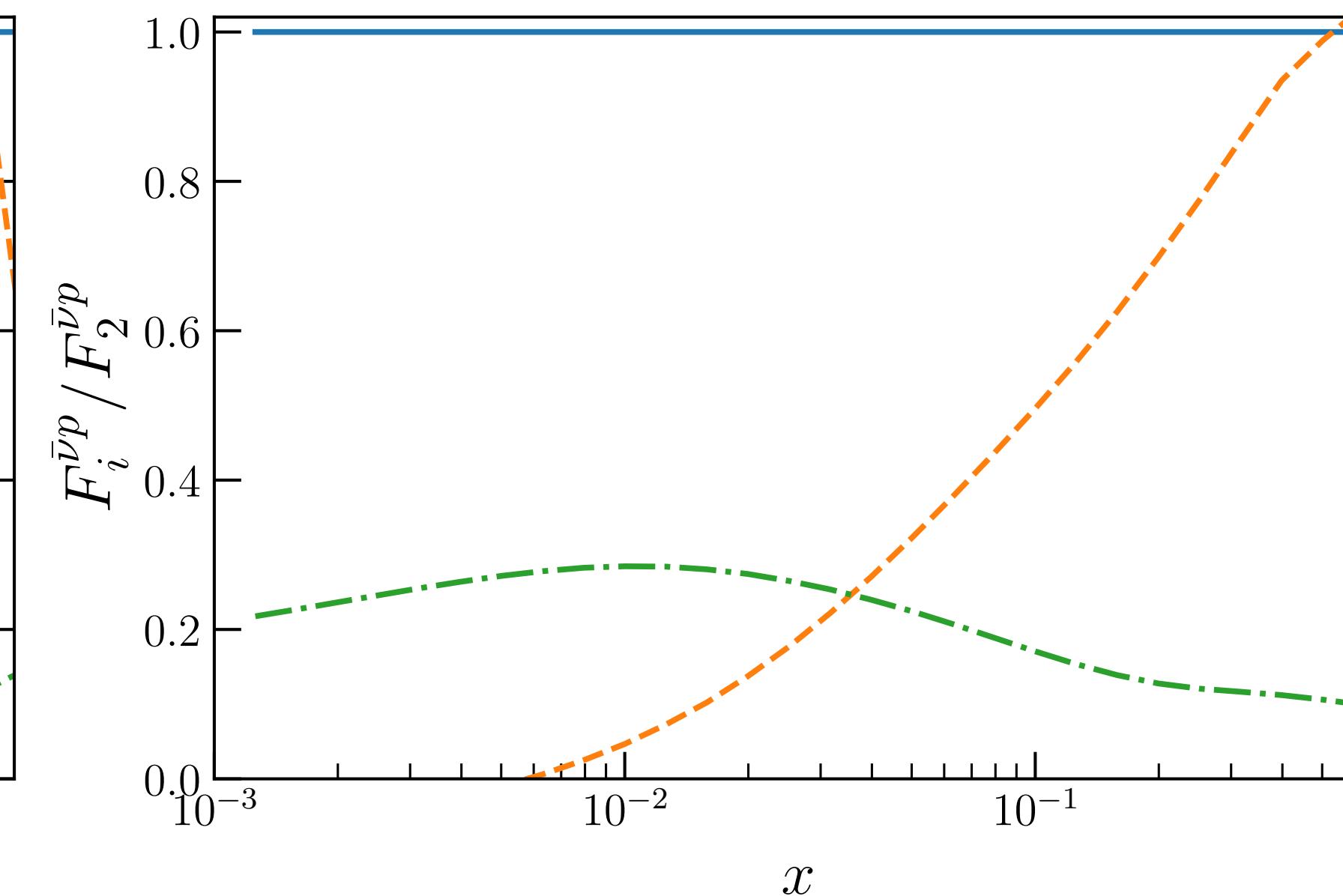
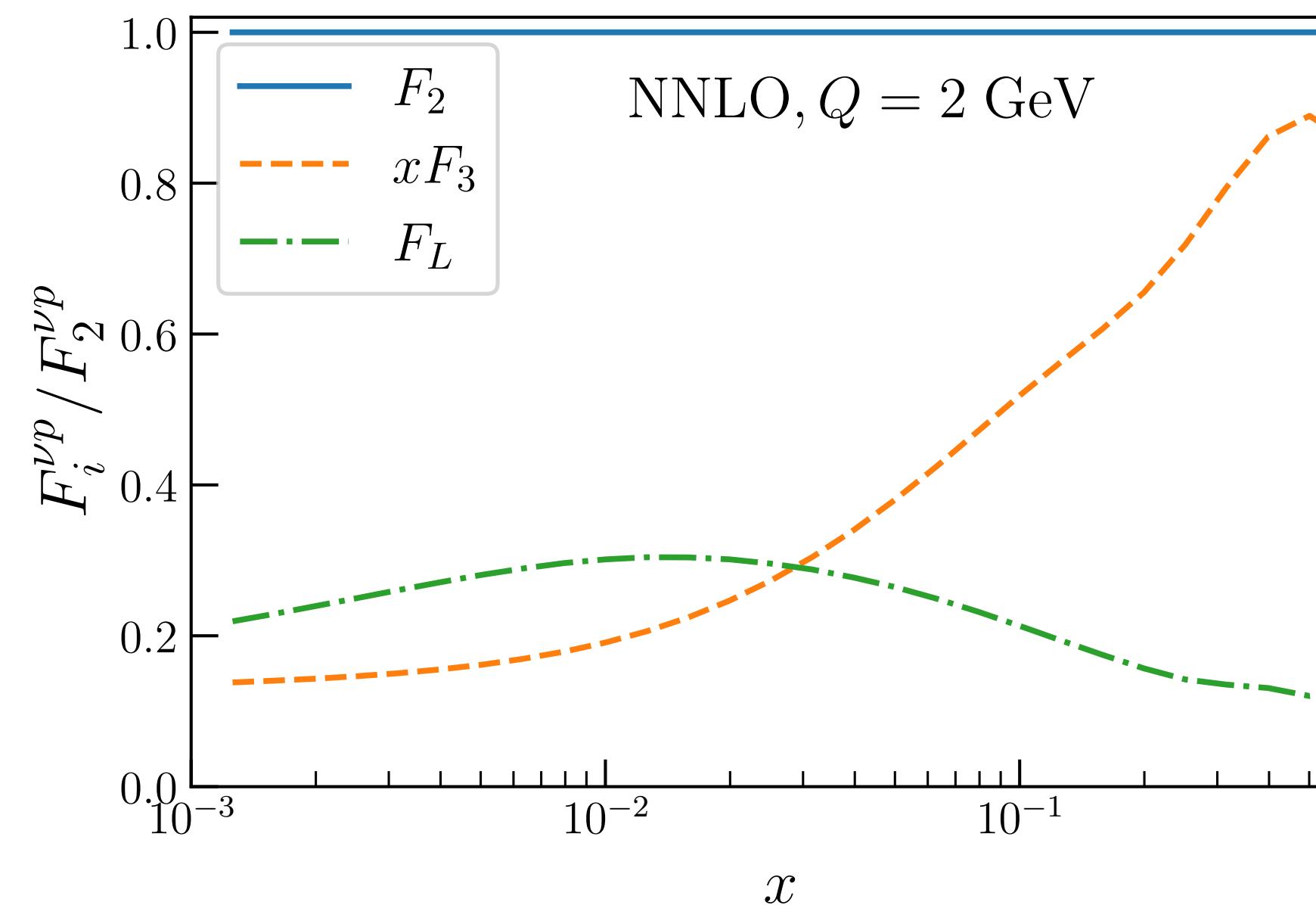
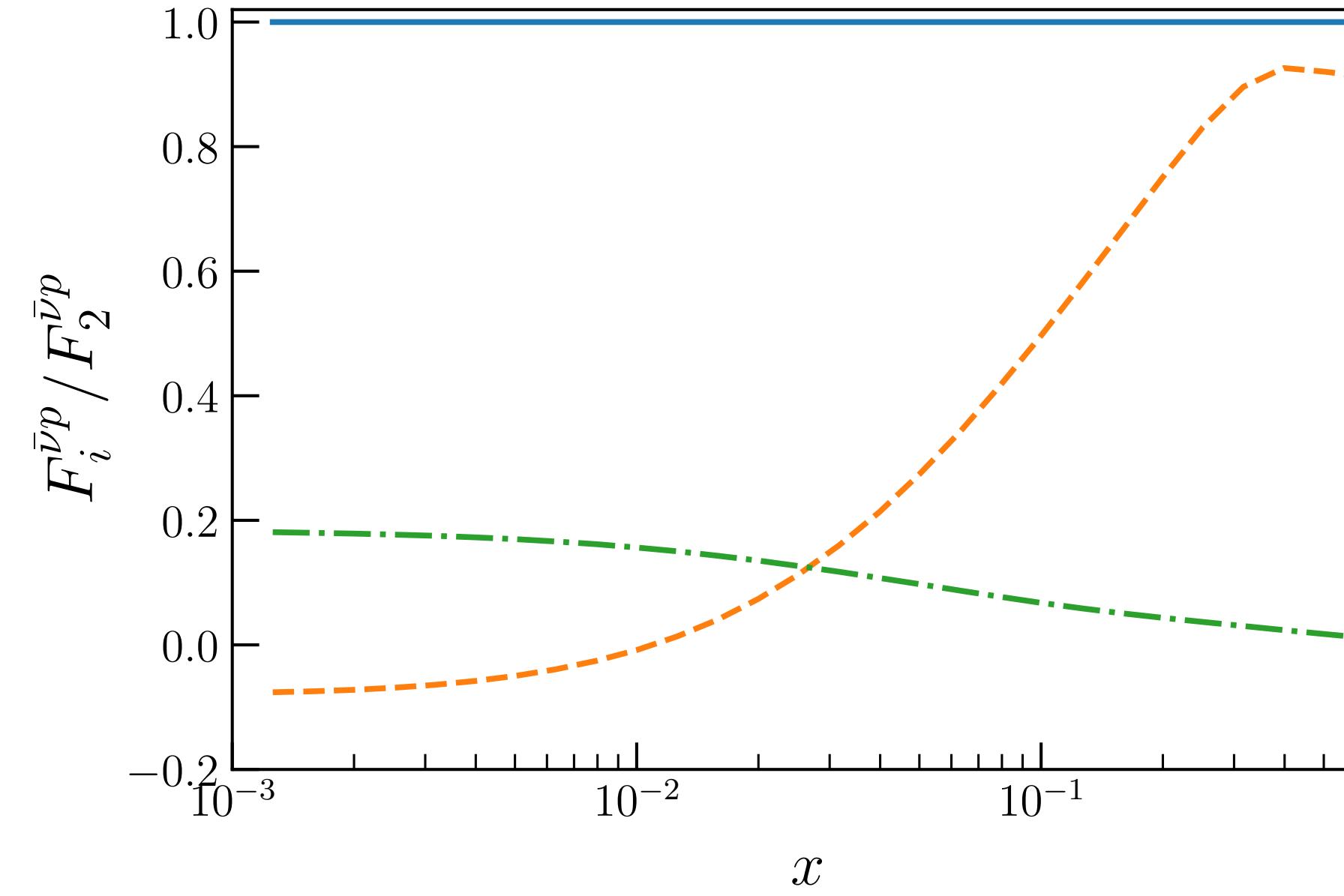
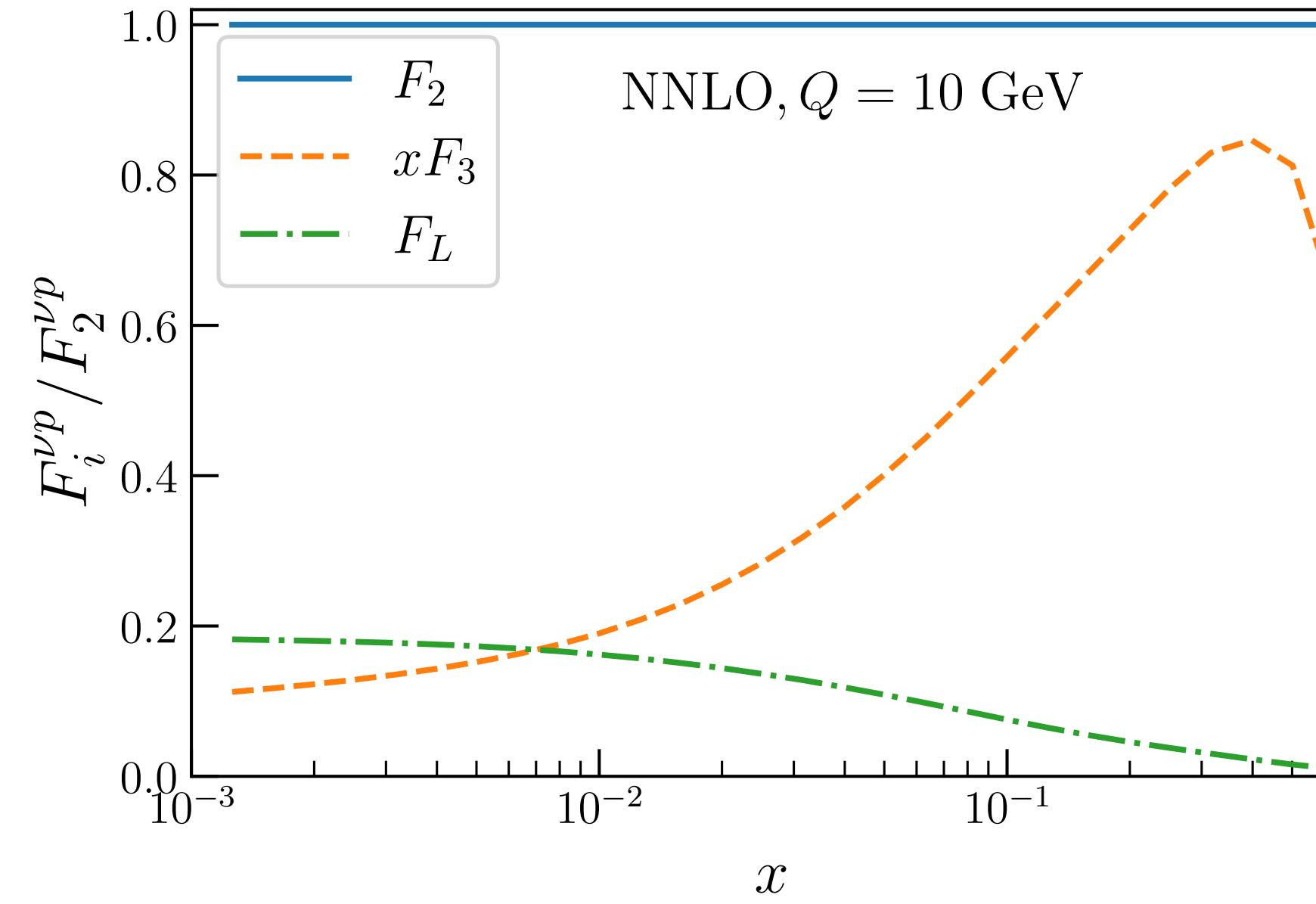
Overview of the different types and accuracy of the DIS coefficient functions currently implemented in YADISM

* Already available as K -factors [64], now being integrated in the grid format.

† Full calculation not available but an approximated expression can be constructed from partial results [105, 106].

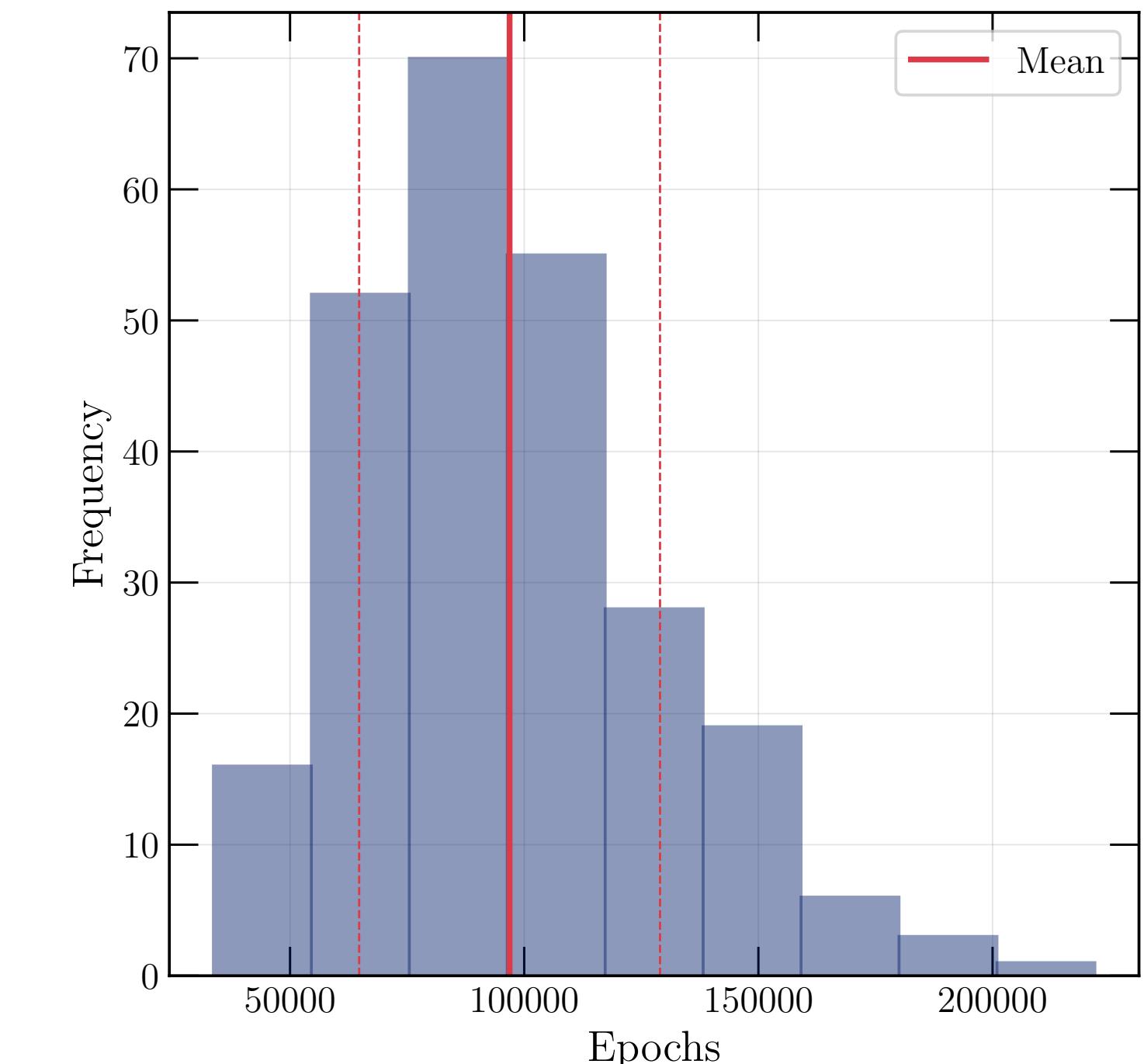
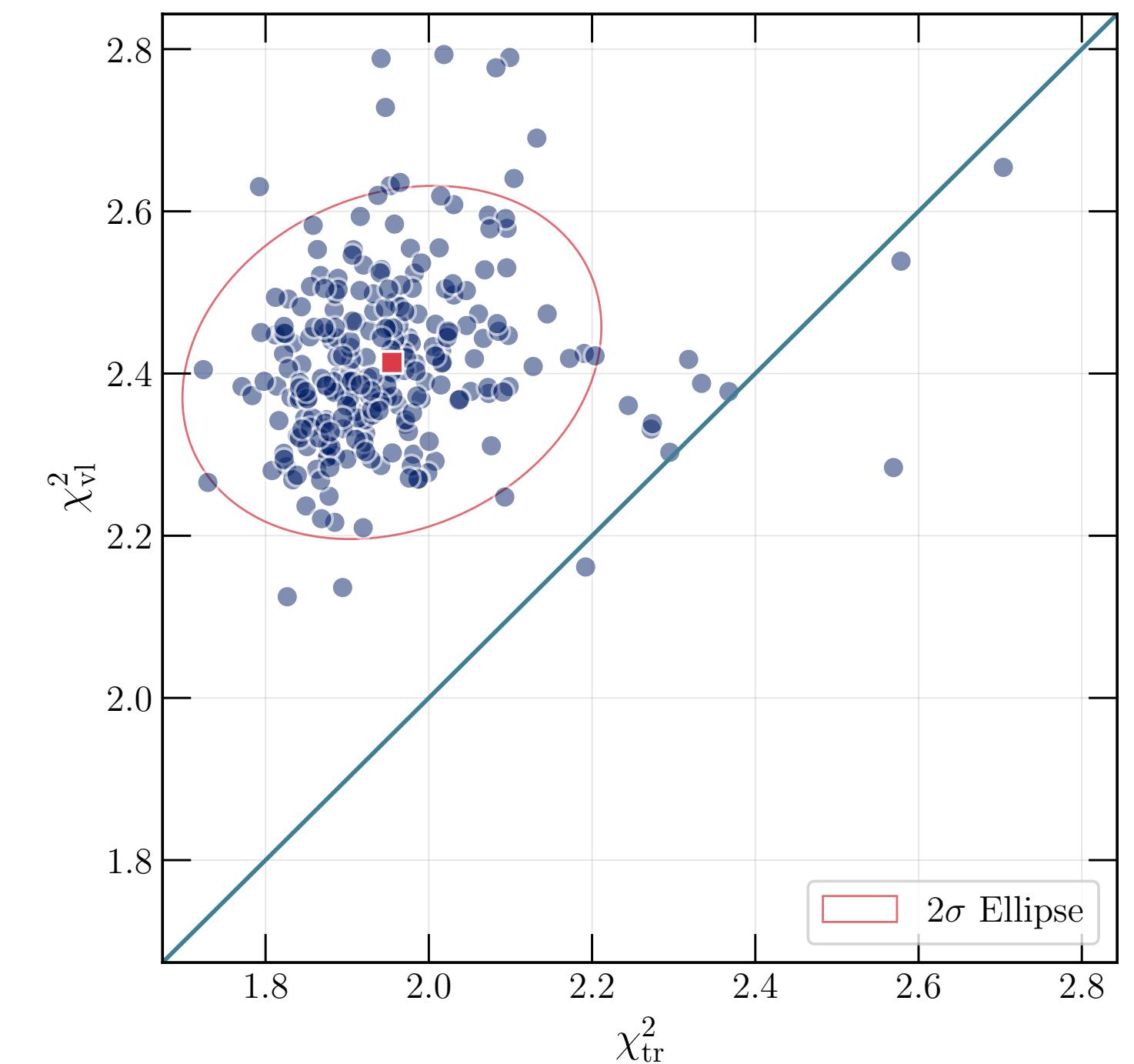
‡ Calculation available, to be implemented.

Contributions from the Individual Structure Functions

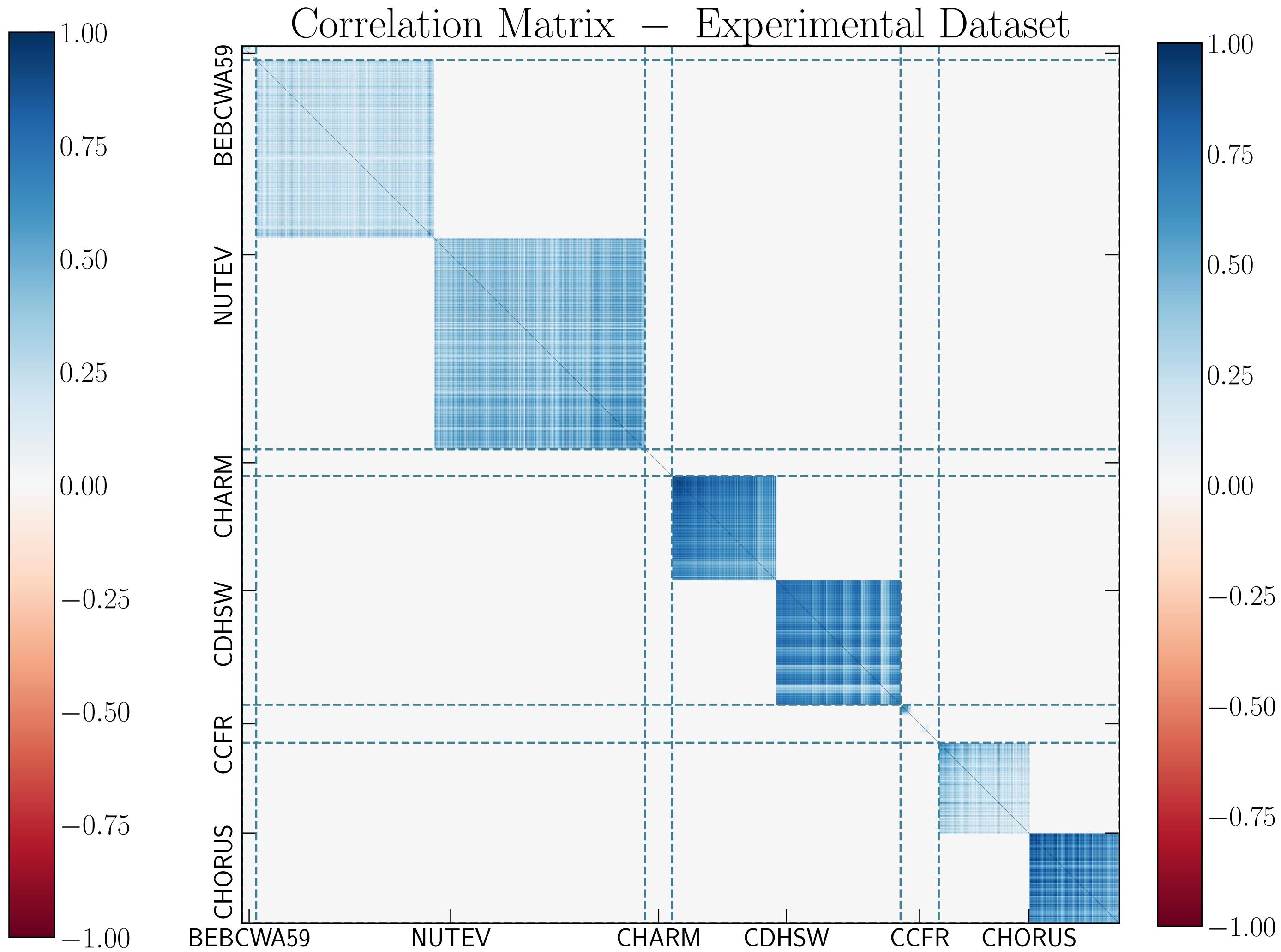
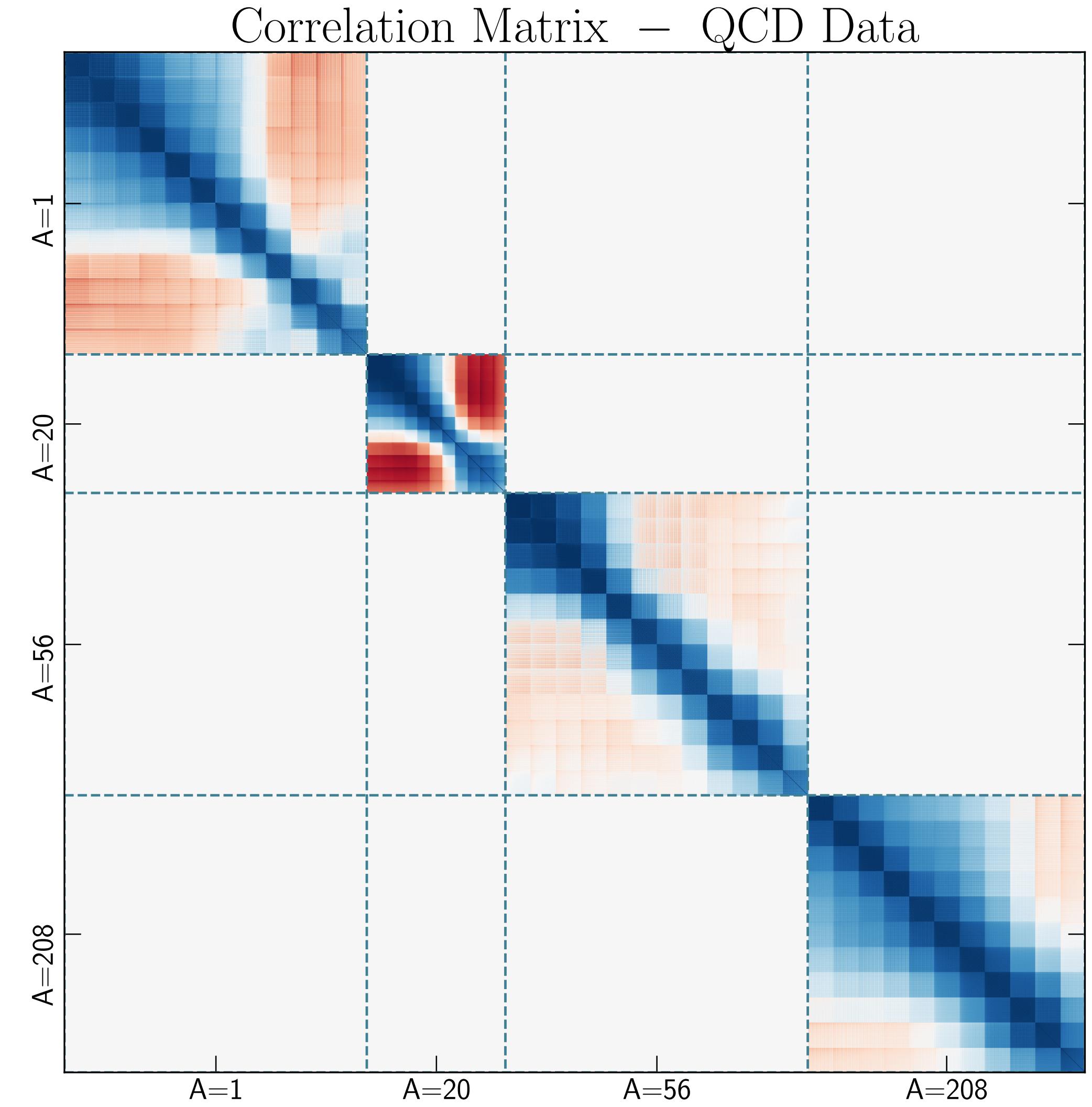


Stability of the Fits

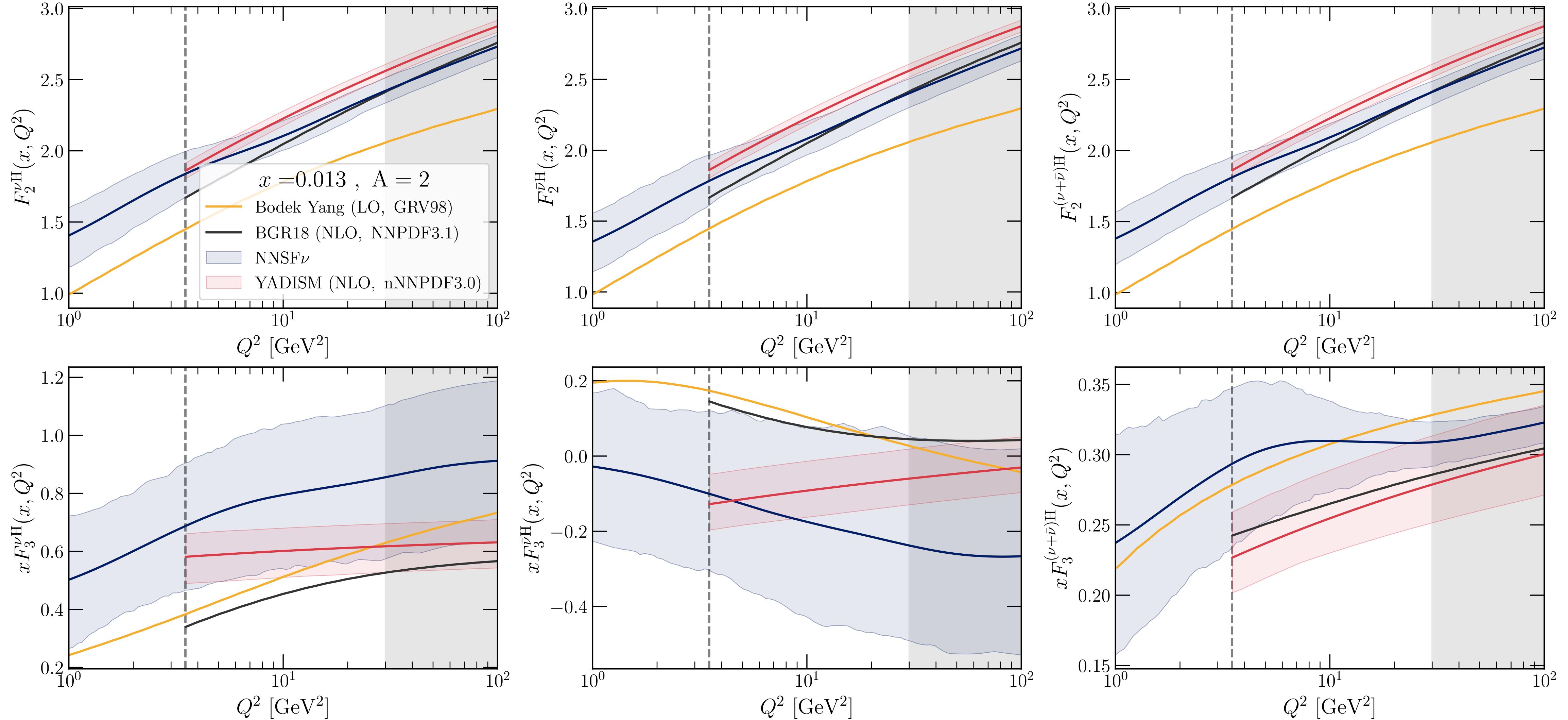
Dataset	Target	Observable	n_{dat} (cuts)	χ^2_{exp} (wo QCD)	χ^2_{exp} (baseline)
BEBCWA59	Ne	F_2	57 (39)	1.673	2.088
		xF_3	57 (32)	0.842	0.771
CCFR	Fe	F_2	128 (82)	1.902	2.292
		xF_3	128 (82)	0.857	0.946
CDHSW	Fe	$[F_2]$	143 (92)	[6.17]	[5.32]
		$[xF_3]$	143 (100)	[22.9]	[11.7]
		$[F_W]$	130 (95)	[15.9]	[16.4]
		$d\sigma^\nu/dxdQ^2$	847 (676)	1.298	1.351
		$d\sigma^{\bar{\nu}}/dxdQ^2$	704 (583)	1.139	1.237
CHARM	CaCO_3	F_2	160 (83)	1.368	1.324
		xF_3	160 (61)	0.721	0.850
CHORUS	Pb	$[F_2]$	67 (53)	[63.8]	[38.3]
		$[xF_3]$	67 (53)	[6.881]	[2.904]
		$d\sigma^\nu/dxdQ^2$	606 (483)	0.986	1.185
		$d\sigma^{\bar{\nu}}/dxdQ^2$	606 (483)	0.709	0.797
		$[F_2]$	78 (50)	[9.854]	[10.41]
NuTeV	Fe	$[xF_3]$	75 (47)	[6.24]	[3.810]
		$d\sigma^\nu/dxdQ^2$	1530 (805)	1.436	1.542
		$d\sigma^{\bar{\nu}}/dxdQ^2$	1344 (775)	1.254	1.311
		Total	6197 (4089)	1.187	1.287



Experimental &is Theory Correlation Matrix

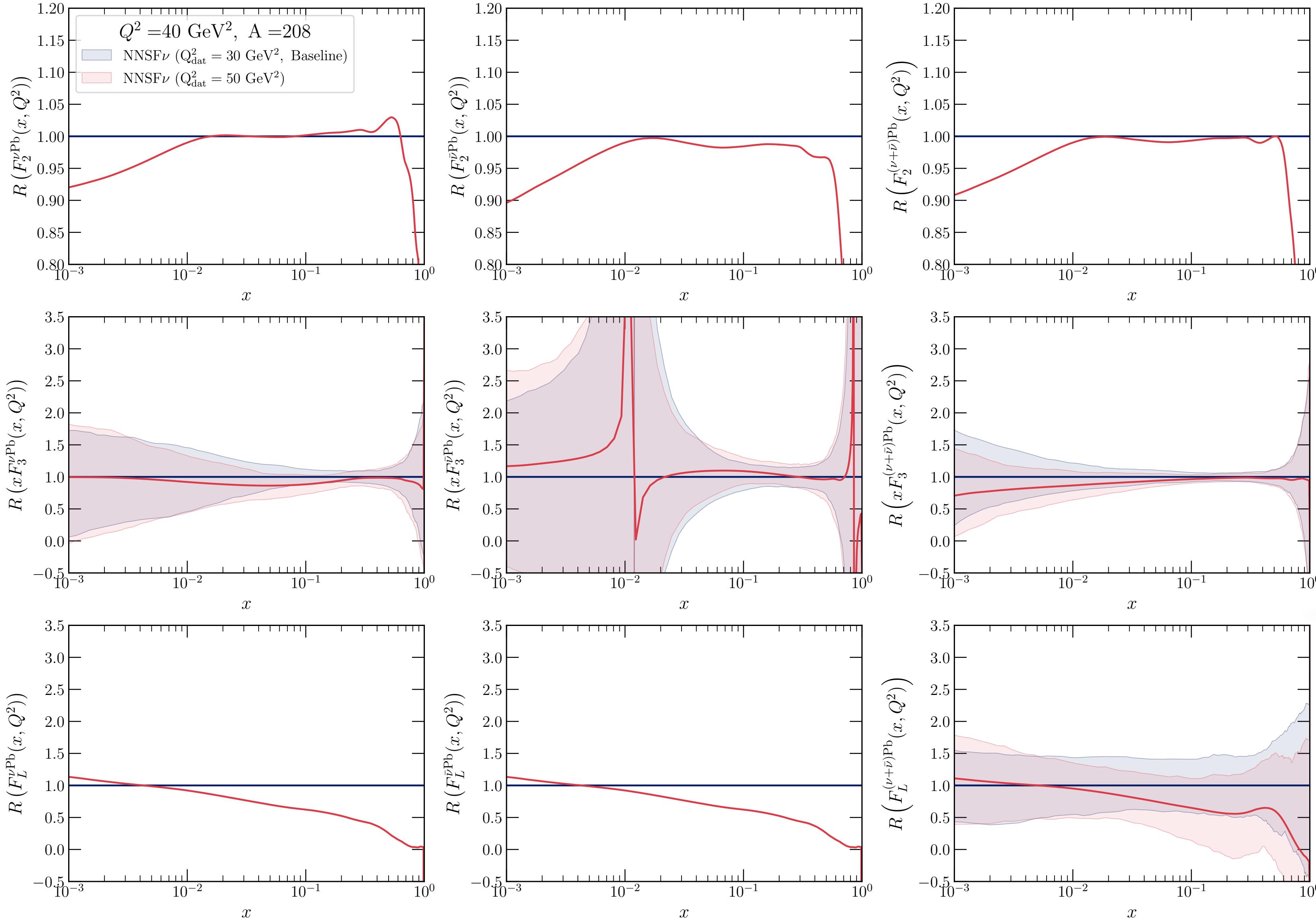


Matching Predictions along the Q^2 regions



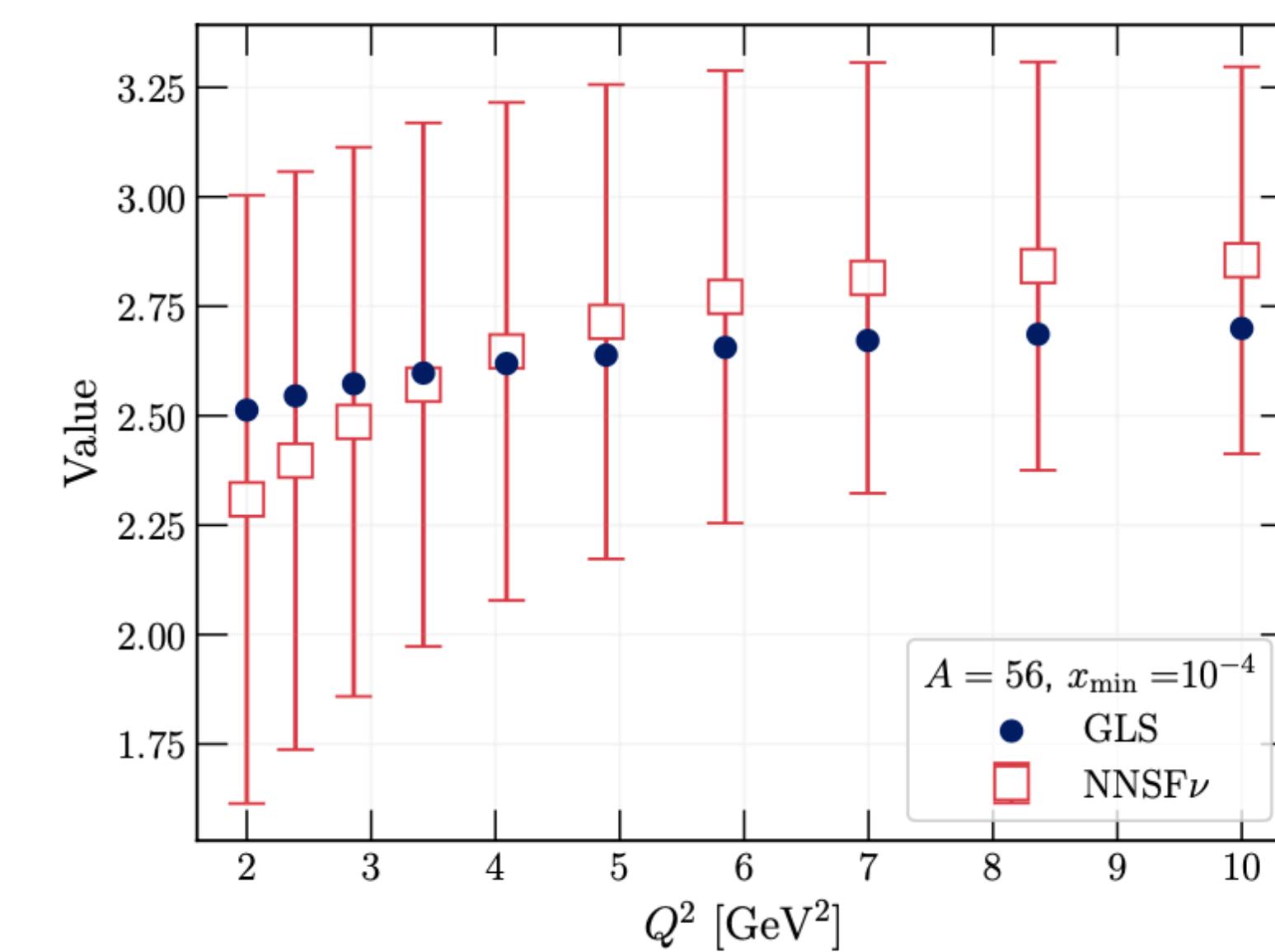
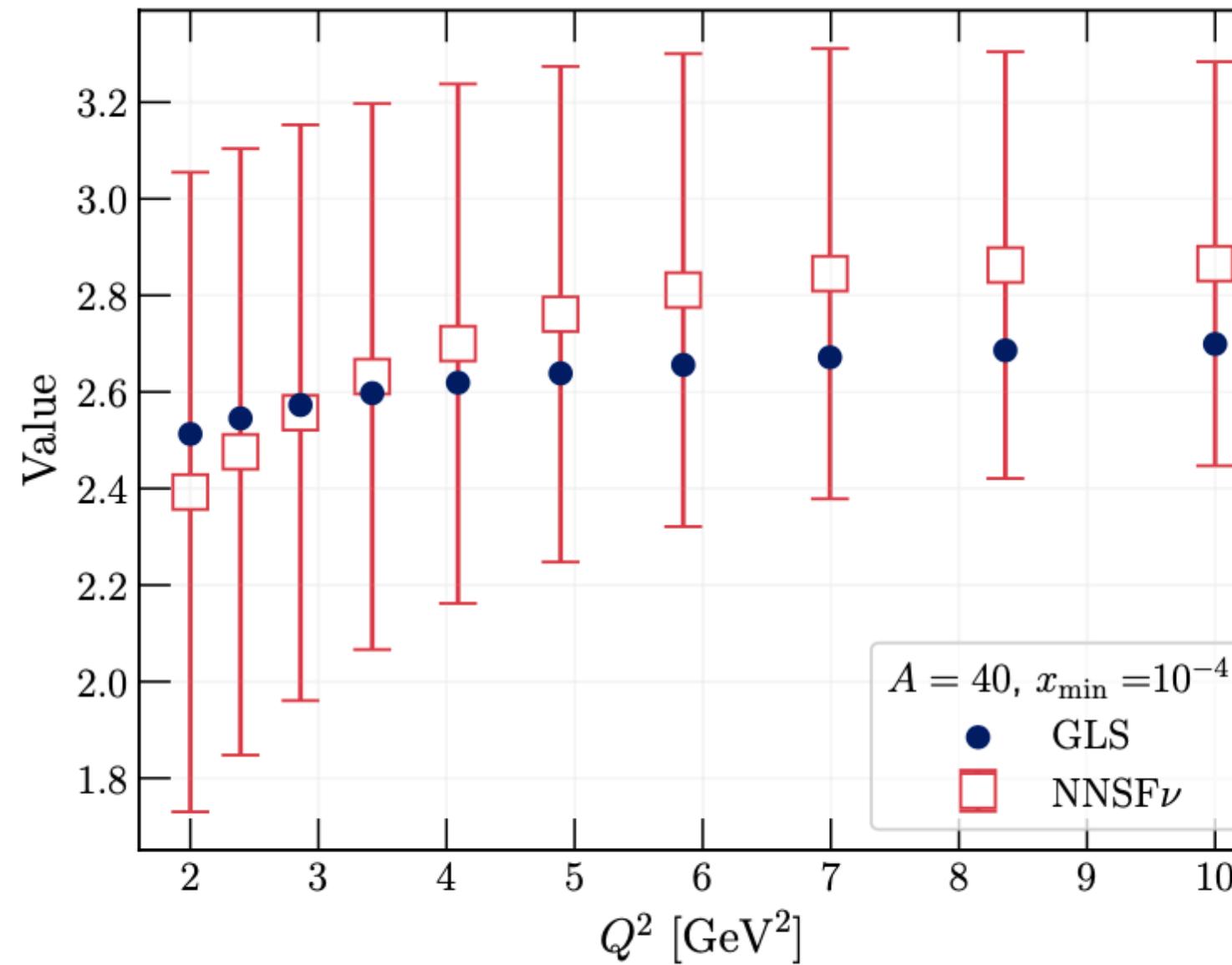
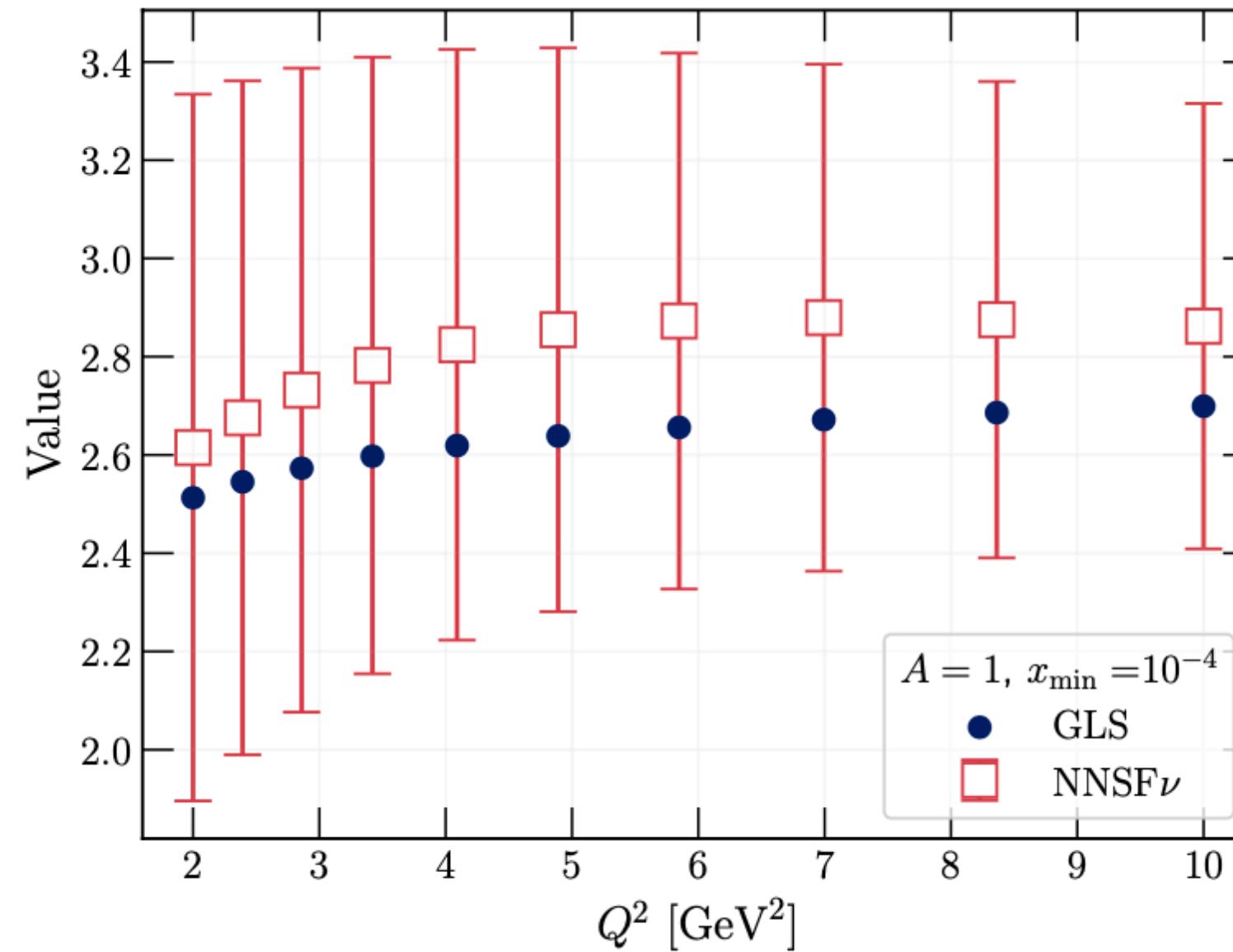
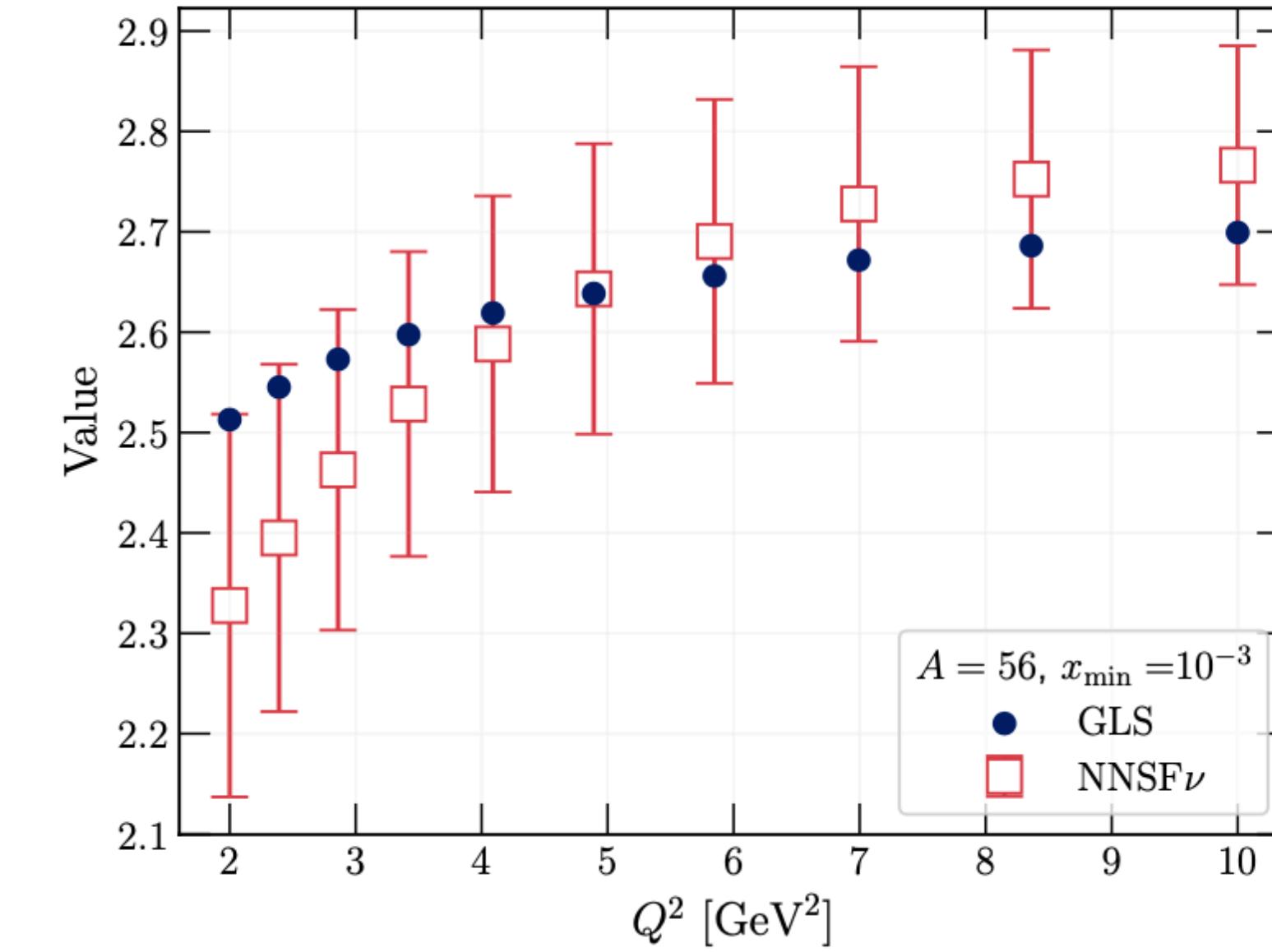
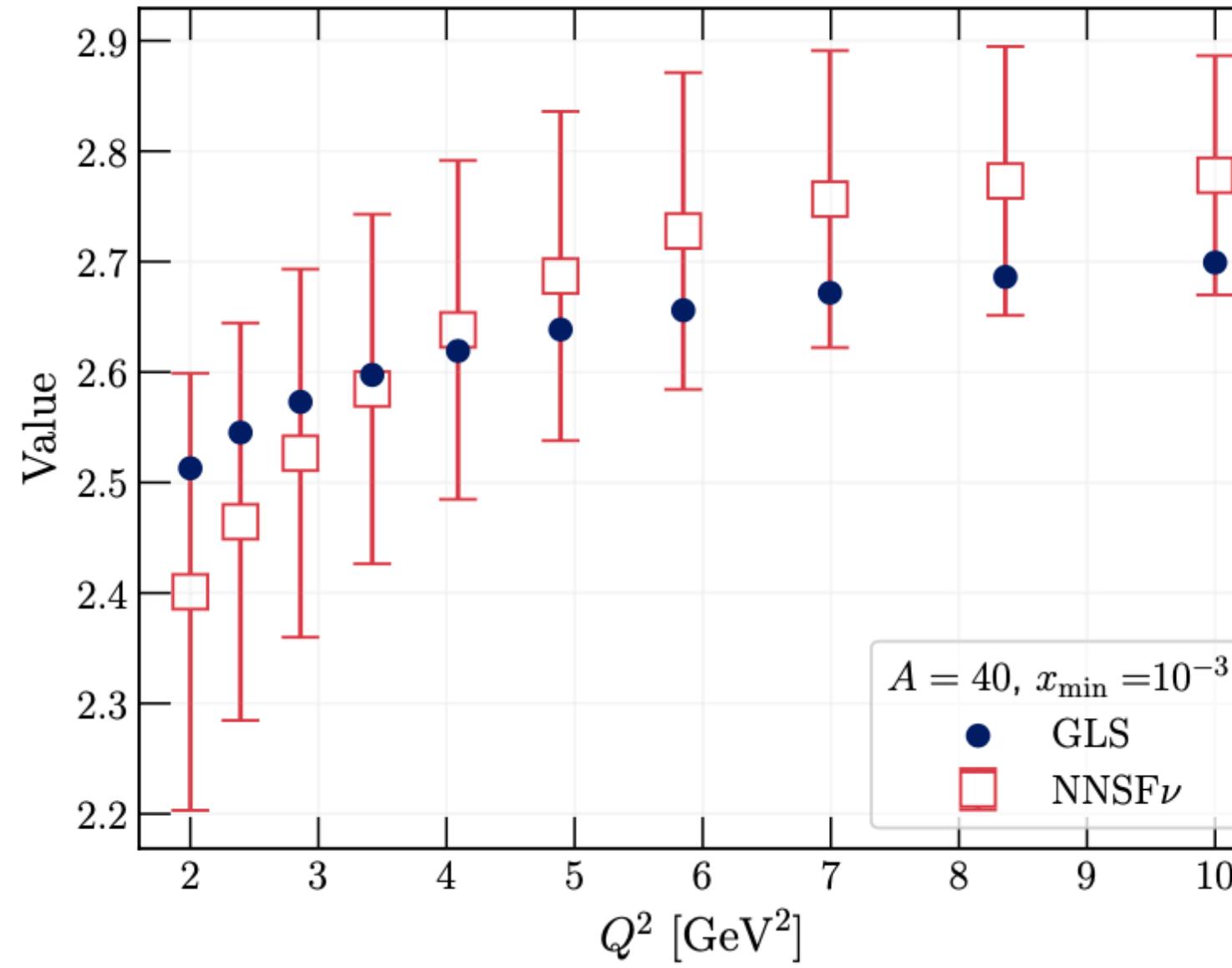
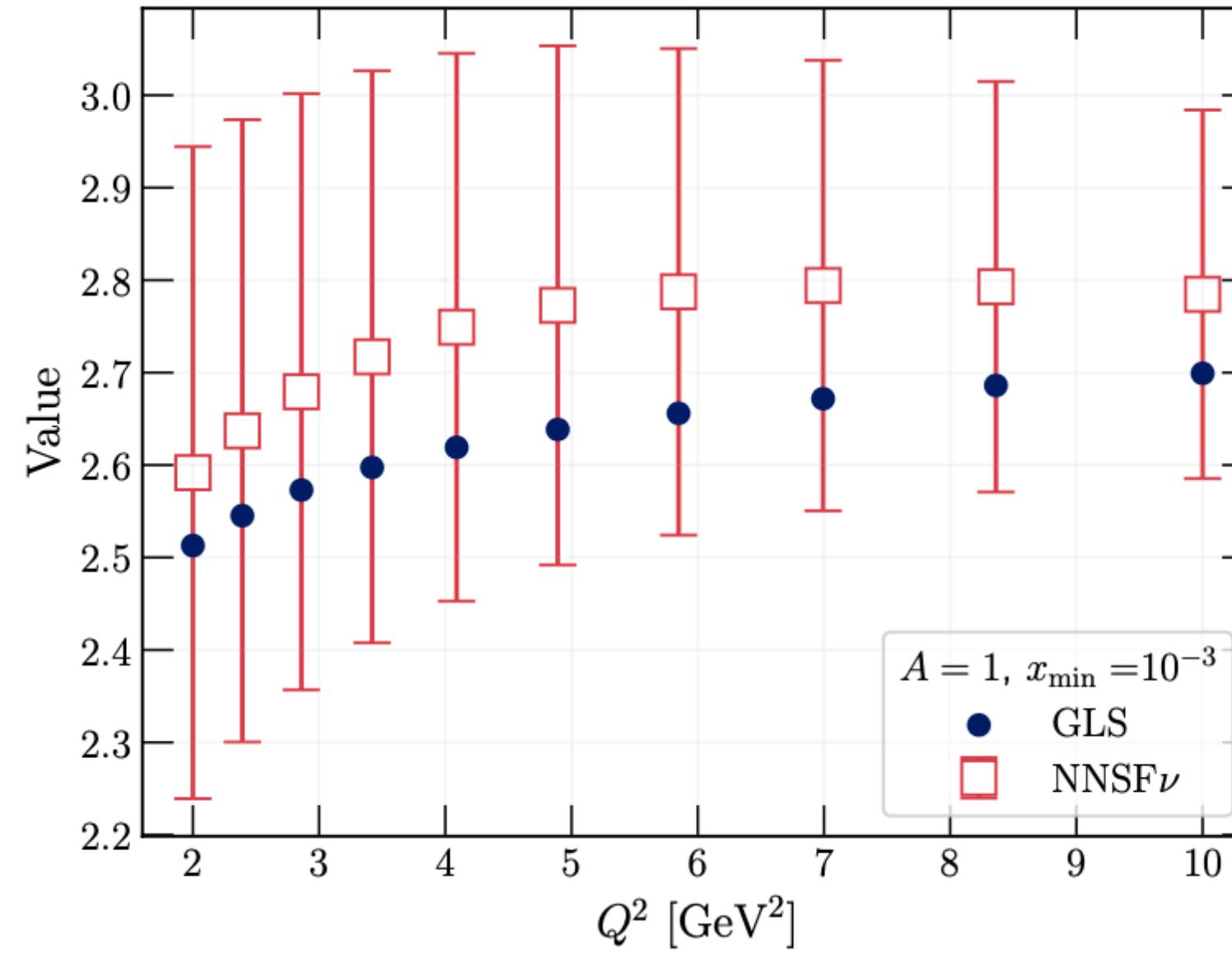
Predictions reproduce the pQCD constraints and are smooth along the entire region of Q^2

Dependence on the Q^2 cuts



The choice of where to split the Q^2 regions yield **very small** differences. The largest differences occur in the extrapolation regions where no experimental data are available.

Predictions for the GLS sum rules



Inclusive Neutrino-Nucleus Cross-Sections

